

# UNIVERSIDADE FEDERAL DE SANTA CATARINA CENTRO TECNOLÓGICO PROGRAMA DE PÓS-GRADUAÇÃO EM CIÊNCIA DA COMPUTAÇÃO

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**Blockchain privacy and scalability in a decentralized validated energy trading context with Hyperledger Fabric**

> Florianópolis 2021

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Dissertação submetida ao Programa de Pós-Graduação em Ciência da Computação da Universidade Federal de Santa Catarina para a obtenção do título de mestre em Ciências da Computação. Supervisor: Prof. Jean Everson Martina, Dr.

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O presente trabalho em nível de mestrado foi avaliado e aprovado por banca examinadora composta pelos seguintes membros:

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Certificamos que esta é a **versão original e final** do trabalho de conclusão que foi julgado adequado para obtenção do título de mestre em Ciências da Computação.



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Florianópolis, 2021.

This work is dedicated to my parents, Carlos and Carla, and anyone who positively impacted my life.

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#### **RESUMO**

O uso de energia renovável vem aumentando devido à preocupação com preservação do ambiente ameaçada por fontes energéticas como carvão e petróleo. Apersar do alto custo de fontes renováveis em relação às fontes sujas, essa diferença tem diminuido. Com preços mais baixos, pessoas instalam painéis solares para reduzir o custo da conta de eletricidade ou até vender o excesso produzido à empresa transmissora. Quando pessoas vendem energia à rede elétrica, elas são classificadas como prosumers. Geralmente, prosumers podem vender a energia gerada exclusivamente à companhia de eletricidade, que determina o preço de compra. Mercados de energia decentralizados podem aumentar tanto a competitividade quanto a adoção de fontes energéticas limpas. Ao mesmo tempo, mercados centralizados apresentam vulnerabildades de segurança e carecem de resiliência. Neste contexto, blockchain é estudada como uma tecnologia para possiblitar a decentralização de mercados de energia, principalmente por ser um banco de dados resiliente, imutável, transparente e seguro. A literatura apresenta diversas soluções envolvendo blockchain e mercados energéticos, todavia mais pesquisa é fundamental para tal implantação. Escalabilidade, privacidade, arquitetura de mercado e segurança do usuário são alguns dos problemas ainda não resolvidos neste tipo de aplicação. Hyperledger Fabric predomina na literatura acerca de mercados de energia e também é usado na implementação do modelo deste trabalho. Este trabalho revisa a literatura a respeito de blockchain em mercados de energia, propõe um modelo, implementa-o, realiza experimentos e analisa a escalabilidade da rede junto com a proporção da sua geração de dados. O modelo permite que energia limpa e validada seja comercializada por compradores anônimos, evitando a exposição dos seus padrões de consumo. O contrato inteligente do Hyperledger Fabric recebe dados proveninentes de sensores e julga se as alegações de geração energética são válidas. Por exemplo, sensores capturadores da velocidade do vento podem evitar que vendedores de energia eólica comercializem quantidades de energia acima da sua capacidade de geração. Depois de validada, a energia é comercializada entre participantes da rede. Modificações no Hyperledger Fabric foram necessárias para implementar o modelo definido. O desenvolvimento da proposta é dividido em três partes: desenvolvimento da rede, desenvolvimento do contrato e desenvolvimento da aplicação. Este trabalho adaptou a implementação do Fabric para realizar os experimentos planejados. Os experimentos foram executados em três fases com configurações distintas para testar a capacidade da rede. A capacidade máxima de transferência foi atingida em uma configuração com 5000 sensores, 5000 compradores e 5000 vendedores. Tanto o ritmo de geração de dados quanto o custo de implantação foram analisados para julgar a viabildade da rede. Este trabalho complementa com resultados empíricos a literatura, a qual carece destes resultados. Além disso, a estrutura do experimento serve como base para pesquisas futuras com Hyperledger Fabric. Ademais, a participação de pesquisadores com formação em engenharia de energia é necessária para o aprimoramento do processo de validação de energia. Este trabalho explorou um conjunto limitado de configurações e trabalhos futuros podem realizar diversos aperfeiçoamentos neste modelo.

**Palavras-chave**: Energia. Blockchain. Performance. Escalabilidade. Anonimidade. Hyperledger.

## **RESUMO EXPANDIDO**

## **Introdução**

Blockchain é uma tecnologia que suporta um banco de dados decentralizado no contexto [Peer-to-Peer \(P2P\)](#page-16-0) e é amplamente conhecida por causa da cripto moeda Bitcoin [\(RAHOUTI](#page-138-0) et al., [2018\)](#page-138-0), com uma estrutura segura contra adulterações. Blockchain permite a ocorrência de transações seguras entre nodos, sem a necessidade de uma terceira parte confiável. Também é reconhecido como uma tecnologia com potencial parar aprimorar o papel de consumidores em um mercado de energia, aumentando segurança e reduzindo custos [\(WANG, N.](#page-139-0) et al., [2019\)](#page-139-0).

Na maioria dos sistemas de distribuição energética, residências com fontes de energia renováveis podem vendê-la apenas para a companhia de transmissão, o que impede ampla negociação de preço entre múltiplos compradores. Pesquisadores têm avaliado blockchain como um facilitador para a implantação de um mercado energético decentralizado, onde residências poderiam negociar energia entre elas.

A adoção de energia renovável, como solar e eólica, é considerada uma importante medida para reduzir a emissão de gases relacionados ao efeito estufa. No final de 2018, o estado da Califórnia tornou obrigatória a instalação de painéis solares em novas construções. A queda abrupta dos custos de instalação também impulsiona a adoção de fontes renováveis [\(ORSINI](#page-137-0) et al., [2019\)](#page-137-0). Mesmo que a lei da Califórnia não tenha sido totalmente aplicada, ela representa um movimento em direção à energia limpa e decentralizada.

Medidores inteligentes são uma outra tecnologia necessária em um mercado energético decentralizado. Eles medem a quantidade de energia comprada e vendida na rede de energia. Medidores inteligentes, aliados a blockchain, permitem que companhias de energia e prosumers - residências que eventualmente vendem energia à rede - participem em um mercado de energia decentralizado em tempo real, sem pagar nenhuma taxa [\(JOGUNOLA](#page-136-0) et al., [2019\)](#page-136-0).

[\(ALAM, Asraful](#page-133-0) et al., [2019\)](#page-133-0) defende que um mercado de energia em um microgrid poderia aumentar a receita dos prosumers, reduzir o custo de energia e impor eficiência energética. Um microgrid é uma fonte alternativa quando os grandes sistemas de transmissão sofrem algum apagão. Condições de tempo severas que causaram apagões motivaram a criação do Brooklyn Microgrid em Nova Iorque [\(MENGELKAMP](#page-137-1) [et al.](#page-137-1), [2018\)](#page-137-1). Lá, o microgrid pode operar em modo "ilha" independente das grandes linhas de transmissão, obtendo maior resiliêcia.

Além de melhorar o sistema energético, o crescimento de fontes energéticas renováveis trazem benefícios ao meio ambiente. Considerando essas vantangens e que blockchain é visto como uma possível ferramenta para viabilzar um mercado de energia decentralizado, pesquisa neste tema pode conduzir a conclusões mais firmes a respeito da aplicação de blockchain a mercados de energia.

[\(JOHANNING; BRUCKNER,](#page-136-1) [2019\)](#page-136-1) avaliou projetos envolvendo blockchain e energia. Apesar de reconhecer o potencial de se usar blockchain para comercializar energia, os autores criticaram a documentação rasa dos projetos existentes. Também argumentaram que trabalhos futuros devem trazer contribuições com mais profundidade científica para convencer de que o risco de aderir a blockchain compensa.

[\(WANG, N.](#page-139-0) et al., [2019\)](#page-139-0) também analisou soluções com blockchain nos mercados de energia. O artigo deles indica a demanda por aperfeiçoamentos no incentivo do sistema, consenso, regulação, testes com camada física e o impacto da escalabilidade. [\(BLOM,](#page-134-0) [2018\)](#page-134-0) apontou que medidores inteligentes talvez não possuam capacidade de processamento para participar na blockchian, dependendo da complexidade do mercado. Os dados provenientes de sensores levantam um outro problema lidado na literatura: como um ambiente blockchain suportaria sensores [Internet of Things \(IoT\)](#page-16-1) enviando grandes quantidades de dados.

Um exemplo de trabalho que lida com o problema mencionado dos sensores é o de [\(LE-DANG; LE-NGOC,](#page-135-0) [2019\)](#page-135-0), que utiliza REST [Application Programming Interfaces](#page-16-2) [\(APIs\)](#page-16-2) em dispositivos [IoT](#page-16-1) para previnir uma alta utilização de recursos na blockchain. Considerando estes problemas apresentados, é notavel que pesquisa na aplicação de blockchain com [IoT](#page-16-1) para viabilizar um mercado de energia decentralizado pode contribuir significativamente na área de segurança computacional, visto a relevância do tópico.

# **Objetivos**

O objetivo principal deste trabalho é propor e analisar um mercado de energia [P2P](#page-16-0) que usa blockchain, considerando os modelos de mercados de energia já presentes na literatura. Os objetivos específicos são:

- Propor um novo modelo de comercialização energética [P2P](#page-16-0) em blockchain, conciliando as ideias propostas na literatura e trazer a adoção de tal sistema mais perto da realidade.
- Descobrir e propor uma solução razoável de privacidade para proteger os dados dos participantes e, ao mesmo tempo, não esconder seus atos maliciosos na

rede.

- Descobrir e propor um mecanismo razoável para lidar com a quantidade de dados gerada por medidores inteligentes, mantendo a integridade da rede e permitindo escalabildade.
- Avaliar a performance de um sistema de comercialização de energia [P2P](#page-16-0) em blockchain, com soluções de privacidade e escalabilidade para verificar a possibilidade da sua implantação.

# **Metodologia**

Este trabalho foi realizado através de uma metodologia quantitativa, de natureza aplicada, desenvolvida através de uma pesquisa exploratória contendo revisão da bibliografia e experimentação em um estudo de caso. Para isso, foram levantadas soluções da literatura envolvendo blockchain e mercados de energia. Esses trabalhos foram avaliados em termos de detalhamento nas soluções de privacidade, escalabilidade, arquitetura de mercado, implementação e tecnologia utilizada. Em seguida, um modelo de comercialização de energia em blockchain foi projetado, com anonimização dos compradores e processos de validação da energia ali transacionada. Uma análise acerca da performance de tal sistema foi realizada com o prósito de investigar a escala de suporte de participantes, em uma sequência de três rodadas de experimento contendo um ordenador, um peer e um ou dois simuladores de sensores, em uma rede Hyperledger Fabric. O experimento foi executado na estrutura de computação em núvem da [Amazon Web Services \(AWS\)](#page-16-3) para testes com diferentes capacidades computacionais. Com base nos dados proveninentes dos experimentos, discussões e conclusões foram elaboradas sobre o modelo proposto.

# **Resultados e Discussão**

Os principais resultados decorridos da realização dos experimentos e análises estão descritos a seguir:

- A implementação e execução do modelo proposto foram analisados em termos de performance. Primeiramente, os dois possíveis bancos de dados suportados pelo Hyperledger Fabric foram comparados considerando as demandas no modelo desenvolvido e o LevelDB demonstra melhor performance, respondendo a consultas mais rapidamente que o CouchDB.
- Explorando diferentes configurações da rede Hyperledger Fabric e variando a capacidade do hardware que executava o modelo implementado nas três fases experimentais, a rodada mais bem-sucedida suportou 5000 sensores, 5000 compradores e 5000 vendedores transacionando na rede, o que indica a viabilidade

do modelo em um contexto de bairro.

- A utilização de armazenamento foi medida e avaliada, levando à conclusão de que o modelo proposto deveria ser complementado com alguma solução de resumo dos dados após determinado tempo, visto que os mesmos perdem a importância com o passar do tempo e em um ano um peer e um orderer gerariam 22.7 [Terabyte \(TB\).](#page-17-0)
- Com base na demanda por processamento, armazenamento e os custos da estrutura de computação em núvem da [AWS,](#page-16-3) uma estimativa de custo foi calculada e comparada com o custo de transação da rede Ethereum, que apesar de distinta do Hyperledger Fabric, é uma tecnologia relevante e presente em muitos trabalhos. O custo estimado foi de  $9.92 * 10^{-6}$  [United States dollars \(USD\)/](#page-17-1)transação, enquanto o custo considerado na rede Ethereum foi de 0.5 [USD/](#page-17-1)transação.
- Comparando aos trabalhos relacionados, o modelo proposto trouxe mais clareza e detalhamento sobre a relação entre blockchain e mercados de energia, cobrindo aspectos como privacidade, escalabilidade, profundidade experimental e dados empíricos. A comparação mais pertitente foi com o trabalho de [\(BLOM,](#page-134-0) [2018\)](#page-134-0) que utilizou Ethereum para implementar um mercado de energia com 600 participantes, enquanto o protótipo deste trabalho suportou 15000, somando o número de sensores, compradores e vendedores. O custo da rede aqui analisada também foi significativamente mais baixo.

# **Considerações Finais**

Este trabalho propôs, implementou e analisou um merdcado de energia em blockchain com validação a partir de dados provenientes de sensores [IoT.](#page-16-1) Isso é garantido por um contrato inteligente executado por múltiplas organizações e que requer um quroum mínimo delas para considerar uma geração de energia válida. A implementação protege o padrão de consumo dos compradores de energia por meio de um algoritmo de [k-Times Anonymous Authentication \(k-TAA\).](#page-16-4) A performance e o custo do modelo foram avaliados e comparados com outro trabalho relevante que utilizou Ethereum como plataforma de implementação. Tal comparação indicou que este trabalho obteve melhores métricas. Como contribuições secundárias, métodos de pesquisa diversamente configuráveis envolvendo Hyperledger Fabric foram apresentados. Modificações na implementação do Hyperldger Fabric também foram realizadas, visando ampliar o suporte a domínios de aplicações diversos. Além disso, análises dos bancos de dados no contexto do modelo foram apresentadas, podendo contribuir para escolhas adequadas em trabalhos futuros.

Pesquisas futuras devem aprimorar a estimativa de geração energética renovável

com base nos dados meteorológicos originados em sensores [IoT.](#page-16-1) Junto a isso, este trabalho não explorou amplamente configurações da rede Hyperledger Fabric, adicionando mais peers e orderers para avaliação de desempenho, o que pode ser realizado também. Pesquisa com o acoplamento de um banco de dados georreferenciado ao blockchain pode contribuir para a performance do modelo proposto. A participação de sensores precisa ser estudada mais profundamente, visto que neste trabalho eles foram apenas simulados e nenhuma análise a respeito da sua capacidade de participar em uma rede blockchain foi feita.

**Palavras-chave**: Energia. Blockchain. Performance. Escalabilidade. Anonimidade. Hyperledger.

#### **ABSTRACT**

Renewable energy use has increased with environmental concerns due to the pollution generated by energy sources like coal and oil. Even though the cost of renewable energy was initially much higher than power from dirty sources, the gap in cost has been decreasing. With lower prices, people install solar panels to reduce their electricity bill or, in some cases, even sell the surplus generated energy to the grid and earn credits from the grid operator. When people sell power to the grid, they are named prosumers. Generally, prosumers are limited to trade the energy they generate with the grid company, dominant in price determination. Decentralized energy markets might increase both market competitiveness and incentive to further people's adoption of renewable energy. Also, a centralized energy market presents security vulnerabilities and a lack of resiliency. In this context, blockchain is a widely studied technology to provide decentralization for energy markets, mainly because of blockchain's capabilities of being a cyber-resilient, immutable, transparent, and secure distributed database. The literature shows many solutions to coupling blockchain and energy markets, but much research is still needed to enable it. Scalability, privacy, market design, and user security are some of the open research topics of this kind of application. Hyperledger Fabric predominantly appears in literature proposals of blockchain solutions in the energy markets context, and it is the tool used for the model implementation. This work analyzes the literature related to blockchain and energy markets, proposes a model, implements it, performs experiments, and analyzes network scalability and data generation. The model enables validated clean energy trading with anonymized buyers to prevent consumption pattern exposure. The Hyperledger Fabric chaincode constantly receives sensors data and judges sellers' energy generation claims to be valid or not. For example, sensors capturing wind speed might help prevent dishonest wind power sellers from selling more than they could generate. Once the energy is validated, it can be exchanged among participants. Modifications on Hyperledger Fabric were necessary to implement the defined model. The proposal development is sectioned into three parts: network deployment, chaincode development, and applications development. This work adapted Fabric's implementation to perform scalability experiments with an increasing number of buyers, sellers, and sensors. The experiments consist of three phases with configurations changes aiming to increase the network capacity. The maximum transaction throughput was achieved with 5000 sensors, 5000 buyers, and 5000 sellers. The data generation rate by the network and the baseline deploy costs were also analyzed to judge the network viability. This work brings empirical results on a topic which the literature lacks. Furthermore, the experiment structure serves as a guideline for new research with Hyperledger Fabric, regardless of the application field. Energy engineering researchers' participation is required for enhancing the proposed models' energy validation process. This work explored a limited set of configuration variables, and future works have countless different settings to analyze.

**Keywords**: Energy. Blockchain. Performance. Scalability. Anonymity. Hyperledger.

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# **LIST OF SYMBOLS**

- *Ysc* Yearly storage cost (USD)
- *GBMc* AWS charge for monthly gigabyte storage allocation (USD)
- *Yg* Monthly data generation (GB)

# **CONTENTS**

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#### <span id="page-23-0"></span>**1 INTRODUCTION**

This Chapter presents our work motivation on the blockchain energy markets theme, our research questions, and our work objectives. It briefly introduces the concepts, tools, and problems which we deal with during the text.

#### <span id="page-23-1"></span>1.1 MOTIVATION

Blockchain is a technology that enables a decentralized database in a [P2P](#page-16-0) context. It is widely known because of Bitcoin cryptocurrency [\(RAHOUTI et al.,](#page-138-0) [2018\)](#page-138-0), and its structure is secure against tampering. Blockchain allows transactions between nodes in a safe manner, without a TTP (Trusted Third-Party). It is considered as having the potential to enhance the role of consumers in the energy trading system by increasing security and reducing costs [\(WANG, N. et al.,](#page-139-0) [2019\)](#page-139-0).

In most energy distribution systems, residences with renewable energy sources can only sell their excess produced energy to the utility company, which impedes broader price negotiation with multiple bidders. Researchers have explored blockchain as an enabler of a decentralized energy trading market, where residences could trade electricity with each other.

Renewable energy adoption, e.g., solar and wind, is considered a relevant action to reduce greenhouse gas emissions. In late 2018, the state of California made installing solar panels mandatory on newly constructed buildings. Another driving factor for its adoption is that renewable energy costs have steeply declined [\(ORSINI](#page-137-0) [et al.,](#page-137-0) [2019\)](#page-137-0). Even though the California 2018 law was not 100% applied, it represents an upcoming move towards clean and decentralized power.

One relevant experiment with renewable energy is the Brooklyn Microgrid [\(MENGELKAMP et al.,](#page-137-1) [2018\)](#page-137-1). In this project, the company LO3 Energy installed a microgrid on top of the existing distribution grid and implemented a peer-to-peer energy market on a small scale using blockchain. Until May 2021, the regulations for peer-to-peer energy trading in New York still do not exist, which prevents a broader adoption of the system.

Smart meters are another necessary technology for a decentralized energy system operation. They measure the amount of energy bought and the amount of energy that is sold to the grid. Smart meters, alongside blockchain, allow energy companies and prosumers - residences that eventually sell electricity to the grid to adopt business-to-business or prosumer-to-prosumer energy trading in real-time with, potentially, no fees [\(JOGUNOLA et al.,](#page-136-0) [2019\)](#page-136-0).

There are still open research topics on the blockchain energy trading schemes in terms of system design, privacy methods to protect user data, and scalable solutions to deal with the amount of data collected through the smart meters [\(WANG, N.](#page-139-0) [et al.,](#page-139-0) [2019\)](#page-139-0). [\(ANDONI et al.,](#page-133-2) [2019\)](#page-133-2) argues that consumers might resist blockchain use in the energy markets due to lack of privacy and that this context requires a blockchain with low latency and delay. These topics must be addressed to bring this type of system closer to adoption. We focus on analyzing the **scalability** of our blockchain energy trading model with **privacy**-preserving tools.

#### <span id="page-24-0"></span>1.2 JUSTIFICATION

[\(ALAM, Asraful et al.,](#page-133-0) [2019\)](#page-133-0) argue that a power market in a microgrid could increase the prosumer revenue, reduce energy cost, and enforce efficient energy utilization. A microgrid is an alternative power source when the main grid systems blacks out. Severe weather events that caused blackouts in New York City motivated the implementation of the Brooklyn Microgrid project [\(MENGELKAMP et al.,](#page-137-1) [2018\)](#page-137-1). In Brooklyn, the microgrid can operate in island mode, even when the primary grid does not provide power, which improves power resilience.

Beyond energy system improvement, the growth in renewable energy production brings environmental benefits. Considering the mentioned advantages and that blockchain is seen as a possible tool for achieving a decentralized energy market in a microgrid, research on the theme can lead to firmer conclusions on the viability of coupling blockchain with energy markets.

[\(JOHANNING; BRUCKNER,](#page-136-1) [2019\)](#page-136-1) surveyed blockchain-based energy projects. Even though they recognized the potential of utilizing blockchain to trade energy, they also found how barely documented the existing schemes were. Authors argued that future work must provide scientific depth to convince taking the risk of using blockchain in the energy system.

In [\(WANG, N. et al.,](#page-139-0) [2019\)](#page-139-0), blockchain-based energy trading solutions were also analyzed. The paper indicates the need for improvements in system incentive, consensus, regulation, tests with the physical layer, and scalability impact. [\(BLOM,](#page-134-0) [2018\)](#page-134-0) considered that smart meters might not have enough processing capacity to join the blockchain, depending on the market system's complexity. The sensors data raises another problem currently researched: how does the blockchain environment fit with constrained [IoT](#page-16-1) sensors sending a high load of data to the network.

<span id="page-24-1"></span>An example of work that deals with the previously presented problem is [\(LE-](#page-135-0)[DANG; LE-NGOC,](#page-135-0) [2019\)](#page-135-0), which uses REST [APIs](#page-16-2) on [IoT](#page-16-1) devices to prevent the issue of high resource utilization by blockchains. Thus, it is notable that research on the blockchain application with [IoT](#page-16-1) to enable decentralized energy trading systems can also lead to significant contributions in the computer security field, since it is a relevant topic.

## 1.3 RESEARCH QUESTIONS

The research questions of our work are the following:

- At what scale blockchain supports an energy trading scheme?
- How can users' consuming data be protected while still keeping them accountable for misbehaving?
- How can the network guarantee that consumers buy the requested type of energy (e.g, solar and wind)?

### <span id="page-25-0"></span>1.4 OBJECTIVES

## <span id="page-25-1"></span>**1.4.1 Main objective**

The main objective of this work is to propose and analyze a [P2P](#page-16-0) energy market system using blockchain, considering the already proposed decentralized energy market models in the literature.

## <span id="page-25-2"></span>**1.4.2 Specific objectives**

The specific objectives are:

- Propose a new blockchain [P2P](#page-16-0) energy trading model, conciliating different ideas proposed in the literature and bring the adoption of such a system closer to reality.
- Find and propose a reasonable blockchain privacy solution that protects user data and, at the same time, does not cover malicious actions in the network.
- Find and propose a reasonable mechanism to deal with the data amount generated by smart meters, keeping network integrity and allowing scalability.
- Evaluate performance metrics of a blockchain [P2P](#page-16-0) energy trading system with privacy and scalability solutions to verify how feasible they are.

### <span id="page-25-3"></span>1.5 WORK STRUCTURE

The rest of this master's thesis is structured as follows: our theoretical framework is placed in Chapter [2.](#page-26-1) In Chapter [3,](#page-45-1) we present our systematic literature review. Chapter [4](#page-51-0) shows the proposed model architecture, while Chapter [5](#page-60-0) presents how we implemented and deployed it. Performed experiments and their objectives are described in Chapter [6,](#page-100-0) and their results are discussed in Chapter [7.](#page-110-0) Chapter [8](#page-130-0) concludes our work and indicates possible future work.

### <span id="page-26-1"></span>**2 THEORETICAL FRAMEWORK**

In this Chapter, we will elucidate three key concepts that are part of our work environment. We are going to explain the essential characteristics of microgrids, blockchain, and smart meters.

### <span id="page-26-2"></span>2.1 GRIDS AND MICROGRIDS

"Microgrids are stand-alone power networks within small communities using renewable energy and energy storage systems" [\(KANG et al.,](#page-136-2) [2018\)](#page-136-2). They are also defined by [\(ALAM, Asraful et al.,](#page-133-0) [2019\)](#page-133-0) as "a cluster of distributed resources, loads and energy storage devices within clearly defined electrical boundaries, which offers higher local reliability and flexibility through the integration of energy resources." Figure [1](#page-26-0) presents the main stakeholders of microgrids.

<span id="page-26-0"></span>When microgrids/grids have smart meters as part of their structure, they become smart grids [\(AVANCINI et al.,](#page-134-1) [2019\)](#page-134-1). Smart meters favor energy automation and reliable power distribution control. They are elucidated in section [2.3.](#page-33-1)





Source: [\(ENERGY,](#page-135-1) [n.d.\)](#page-135-1)

### <span id="page-26-3"></span>**2.1.1 Grid/Microgrid actors**

Different actors from the power structure ensure that the energy can flow from the generating companies to the consumers. The main ones are described below.

- **Generating company**: Responsible for generating power through coal, wind, sun, water, nuclear and other types of resources.
- **Ancillary Services**: Generating companies with a fast start and responsible for keeping frequency stability. They can be required by the [Transmission system](#page-17-2) [operator \(TSO\)](#page-17-2) or [Distribution system operator \(DSO\).](#page-16-8)
- **[TSO](#page-17-2) (Transmission System Operator)**: It is a company responsible for transmission lines on a country scale, using ultra-high voltage lines.
- **[DSO](#page-16-8) (Distribution System Operator)**: Actor who receives energy from the [TSO](#page-17-2) and distributes it to consumers.
- **Consumer**: Residence, business, or industry that consumes energy.
- **Prosumers**: A type of consumer that also generates energy and sells it to the grid. The most usual form is by installing solar panels on a rooftop of a building.
- **Batteries**: A tool to store generated energy to be consumed in the future.
- **ESS (Energy Store System)**: Entity with the role of storing energy on a large scale. Usually, it works with batteries or storing water in the high ground in the form of potential energy.

# <span id="page-27-0"></span>**2.1.2 Energy markets**

Energy markets enable energy trading and help suppliers sell their energy and consumers buy power. Usually, not all consumers are allowed to negotiate in energy markets because they must meet some criteria. Nordpool is a relevant example of the energy market and covers nine European countries. Austria, Belgium, Denmark, France, and Germany participate in this network [\(POOL,](#page-138-1) [2020\)](#page-138-1). There are generally three types of energy markets, each one with different purposes. They are defined below based on [\(PINSON,](#page-138-2) [2018\)](#page-138-2).

- **Day-ahead market**: Supply and demand offers are negotiated for the following day. Offers are matched through an auction.
- **Intra-day market**: Supply and demand offers are negotiated for the following hours of the day. It closes at least 5 minutes before the hour of the scheduled supply. For example, if consumer A desires to buy 20 MWh for the 15:00-16:00 period, they must close the deal until 14:55. Offers are not auctioned but consolidated by a bilateral contract.
- **Balancing market**: System operators [\(TSO](#page-17-2) or [DSO\)](#page-16-8) negotiate with ancillary

services to keep power stability close to real-time. It is used for sudden imbalances or when the imbalances could not be resolved through the intra-day market.

Market clearing is a crucial energy trading concept. It represents the process for matching the supply and demand offers, maximizing social welfare. Linear Program is referenced by [\(PINSON,](#page-138-2) [2018\)](#page-138-2) as a possible algorithm for market clearing. After this process, a system price is found. Supply offers below the system price, and demand offers above the system price are matched.

## <span id="page-28-0"></span>**2.1.3 Benefits of decentralization**

Unlike a centralized distribution, characterized by large power plants generating energy in a centralized, monopolistic way, the decentralized energy schemes propose a fairer system. The traditional centralized energy model is not efficient, has high costs, presents problems with security/privacy, and its development has met a bottleneck [\(WANG, N. et al.,](#page-139-0) [2019\)](#page-139-0).

The first advantage of a decentralized scheme is that energy is produced near the consumers, implying less power loss due to transmission distance. Decentralized grids also enable trading between small producers like prosumers. Otherwise, the prosumers could only trade with the [DSO,](#page-16-8) usually by a price or credit established by the [DSO,](#page-16-8) in a centralized way.

In a market with more players, prosumers are more likely to receive a better value for their produced energy, which raises the incentive for adopting clean energy and reducing greenhouse gas emissions. Lastly, a decentralized energy system improves power resilience because any generation problem at a large power plant can be mitigated by the local prosumers supplying energy.

#### <span id="page-28-1"></span>**2.1.4 Challenges of decentralization**

The increasing number of energy market participants due to energy market decentralization escalates the trading complexity because instead of only trading with the [DSO,](#page-16-8) prosumers can trade with each other. The intermittence of solar and wind generation by prosumers also represents a challenge since it makes it harder for the energy system, as a whole, to keep stability. Clouds suddenly covering the solar panels or wind stoping are typical examples of instability causes. The author of [\(KAUR et al.,](#page-136-3) [2016\)](#page-136-3) deals with this problem by designing a forecast model.

# <span id="page-28-2"></span>2.2 BLOCKCHAIN

Blockchains are distributed ledgers, usually without a central authority, with a tamper-resistant and tamper-evident structure [\(YAGA et al.,](#page-140-0) [2018\)](#page-140-0), enabled through public-key cryptography. This technology became well known for being part of Bitcoin currency. Figure [2](#page-29-0) shows how blockchains are formed. Each block is formed by a header and a data segment. The transaction list is part of the data segment, while the block's cryptographic hash, the previous block's cryptographic hash reference, and a timestamp are parts of the header segment. The nonce represented in the figure is not always essential but depends on the consensus mechanism, which will be further explained. Each transaction performed by a node is digitally signed and can be verified by all nodes using the public key.

#### Figure 2 – Blockchain general structure

<span id="page-29-0"></span>

Source: [\(YAGA et al.,](#page-140-0) [2018\)](#page-140-0)

### <span id="page-29-1"></span>**2.2.1 Categorization**

There are two main categories of blockchain: permissionless and permissioned. Permissionless blockchains allow anyone to join the network, reading, and writing to the ledger as wished. Permissionless blockchains are usually open source. Their consensus rewards publishing protocol-conforming blocks and requires some expense work or stake - to validate blocks. These consensus constraints exist in permissionless blockchains due to unknown user participation, who might act maliciously without possible accountability [\(YAGA et al.,](#page-140-0) [2018\)](#page-140-0).

Permissioned blockchains have some restrictions on who can take certain actions in the network. The level of restrictions can vary according to the permissioned blockchain policy. The ledger might be public for reading, but it may have access control for transacting. These settings depend on the context where the network is applied. With known users, the network consensus algorithm can be lighter than permissionless ledgers [\(YAGA et al.,](#page-140-0) [2018\)](#page-140-0).

### <span id="page-29-2"></span>**2.2.2 Consensus**

Every node of the blockchain network stores the public ledger locally. Therefore they must agree on the state of the ledger. Otherwise, each node would form new

blocks following different criteria, and the network would become inconsistent. Consensus algorithms are mechanisms to ensure that all nodes on the network (or most of them) agree on the state of the legder. As an example, Bitcoin uses [Proof-of-Work](#page-16-9) [\(PoW\)](#page-16-9) consensus algorithm.

Generally, in [PoW](#page-16-9) networks, each newly created block's hash H must meet determined criteria to be considered valid. The criteria might be that H is less than a number X, or H must start with a number of zeros [\(YAGA et al.,](#page-140-0) [2018\)](#page-140-0). The nonce plays an essential role in the process of meeting the criteria. Miners, nodes that try to find the next valid block, calculate the block's hash following the formula  $H =$ hash(transaction list + nonce). The nonce is changed until H meets the criteria. The miner that finds a valid hash for the block is usually rewarded.

[PoW](#page-16-9) consensus takes time and resources from nodes. This is good in a sense because once a miner finds the valid block number Y, the smartest decision for the other miners is to immediately try to mine the next block  $Y+1$  since most likely they will not earn rewards for the block Y.

However, this approach has limitations, like high energy consumption and low throughput of transactions/second [\(WANG, S. et al.,](#page-139-1) [2019\)](#page-139-1). Proof-of-Stake avoids high energy consumption because instead of requiring work, it requires a stake (coins) "deposit," which can be taken away if the block validator behaves against the network protocol.

#### <span id="page-30-0"></span>**2.2.3 Smart contracts**

At first glance, blockchains might seem to be only a ledger to record data, but smart contracts allowed the technology to go beyond that. Smart contracts are a collection of code and data deployed on the blockchain ledger with deterministic execution capabilities, enabling distributed applications.

A participant node deploys a contract in the network, and other nodes might call functions from this contract. The deployer programs the contract's logic as wished and might impose restrictions on who can call and execute the contract's functions.

The contract's programming language is highly attached to the blockchain tool (e.g., Ethereum, Hyperledger), and will be discussed more deeply in subsection [2.2.4.](#page-30-1) In terms of cost, the contract can be charged by the miners/executors based on its complexity, which also will be discussed below.

## <span id="page-30-1"></span>**2.2.4 Tools**

There are different blockchain implementations with different architectures. The most cited by the related work in our literature review are Ethereum and Hyperledger. Both will be explained below.

#### <span id="page-31-0"></span>2.2.4.1 Ethereum

Ethereum is a blockchain platform with a native cryptocurrency called Ether and supports smart contracts, which are programmed in the Solidity programming language. This language was designed to target the Ethereum Virtual Machine (EVM). The main goal of Ethereum creation was to overcome Bitcoin's scripting language limitations and enable Turing-complete applications in a blockchain (VUJIČIĆ et al., [2018\)](#page-139-2). [PoW](#page-16-9) is the consensus algorithm in Ethereum main net, and users pay miners transaction fees using Ether to encourage the transaction execution.

Accounts represent users and smart contracts identities in the Ethereum network. Externally owned accounts identify users, and contract accounts identify contracts. The network uses public-key cryptography to create accounts. Creating an account is equivalent to generating a key pair: a private key and a public key. The account address is derived from the public key. Each account has a balance, while contract accounts also have contract data storage. The network saves this data the current ledger state - and updates it every time a new block is mined [\(TRÓN;](#page-139-3) [JAMESON,](#page-139-3) [2020\)](#page-139-3).

Deployed smart contracts might be programmed maliciously to harm the blockchain. Programming an infinite loop on a smart contract could potentially halt the network. Ethereum uses the gas mechanisms to prevent this type of attack. Gas is the fundamental unit of computation. Usually, one gas represents one computational step.

When a peer wants to perform a transaction calling a smart contract function, they must explicitly inform the maximum transaction gas, limiting the number of the computational operations taken by the miner. Also, the peer must tell in the transaction how much they will pay for each gas (GASPRICE parameter). This tool discourages malicious behavior from peers since they must pay miners to execute each computational step (VUJIČIĆ et al., [2018\)](#page-139-2).

#### <span id="page-31-1"></span>2.2.4.2 Hyperledger

A set of blockchain frameworks forms Hyperledger. Burrow, Fabric, Indy, Iroha, and Sawtooth are among those frameworks. Each of them has its purpose and design goals, and we will focus on the Hyperledger Fabric, considering its adaptability for a wide application range [\(BLUMMER et al.,](#page-134-2) [2018\)](#page-134-2).

Linux Foundation guides the development of Hyperledger Fabric to improve prior permissioned blockchains limitations. Some of those limitations are related to the consensus protocol, contract language inflexibility, denial-of-service prevention from malicious contracts, and smart contract confidentiality [\(ANDROULAKI et al.,](#page-133-3) [2018\)](#page-133-3).

Hyperledger Fabric introduces a blockchain architecture to achieve resiliency, flexibility, scalability, and confidentiality, enabling applications written in a standard programming language. In 2020, Fabric was supporting smart contracts written in Go, Java, and JavaScript programming languages.

The major differences between Fabric and Ethereum are the lack of built-in cryptocurrency (e.g. Ether) and the execute-order-validate approach instead of orderexecute in Ethereum. Hyperledger provides a very modular architecture.

In Ethereum, the smart contracts are public and, to validate a new ordered block created by a miner, all nodes execute the contracts' called functions (orderexecute). Whereas, Fabric consensus protocol follows a different structure. There are three types of peers: endorser, orderer, and validator.

First, a client submits a transaction proposal for endorsers. The endorsers execute the transaction and send back the transaction with the result to the client, digitally signed by them. Then, the client sends the signed transaction to the orderers.

The orderers follow a protocol to agree on which transactions will form the next new block. When they achieve agreement, orderers propagate the new block through the network, and all peers validate it. The validation process follows three sequential steps.

- Validators check if all transactions followed the endorsement policy, requesting that at least  $X$  endorsers sign each transaction.
- Validators check if there is any conflict on the ledger state version used by the transactions.
- If the transaction meets the two mentioned criteria, the ledger is updated with the transaction result.

Hyperledger Fabric form ensures more smart contract confidentiality and transaction throughput than Ethereum since only some endorsers know and execute a specific contract. This represents an advantage over Ethereum, mainly due to the permissioned architecture of Fabric.

In Section [2.5,](#page-36-1) we will present a more in-depth view of Hyperledger Fabric. This tool deserves an exclusive section because it is the one in which we perform our experiments.

#### <span id="page-32-0"></span>**2.2.5 Side-chains**

The side-chains structure allows transactions occurring off the main chain, like Ethereum's main chain, and improves the scalability of blockchains, which is fundamental in scenarios where [IoT](#page-16-1) devices are part of the network [\(JEON; HONG,](#page-136-4) [2019\)](#page-136-4). The efficiency can be obtained because the side-chain might have its design

in terms of block structure, consensus, block time, or other characteristics. Plasma is a framework for using side-chains in the Ethereum environment. Periodically, the Plasma chain can send the Merkle roots of the transactions to the main chain.

Ethereum's main net uses Proof-Of-Work consensus, which is costly and slow. A Plasma side-chain can achieve much higher transaction throughput by adopting a more efficient consensus algorithm, like Proof-of-Authority [\(Proof-of-Authority \(PoA\)\)](#page-16-10) or Delegated Proof-of-Stake, thus providing a faster blockchain network [\(ZIEGLER](#page-140-1) [et al.,](#page-140-1) [2019\)](#page-140-1).

#### <span id="page-33-0"></span>**2.2.6 Privacy**

A Blockchain's important characteristic is the immutability and the possibility to verify performed transactions on the ledger. However, blockchains face challenges for ensuring the privacy of network users' data and complying with privacy regulations. Solutions like SMPC (Secure Multiparty Computation), Zero-Knowledge Proofs, mixing services, ring signatures, commitment schemes, homomorphic encryption, attribute-based encryption, and secret sharing are possible tools that might be used to improve blockchains' privacy [\(BERNAL BERNABE et al.,](#page-134-3) [2019\)](#page-134-3).

#### <span id="page-33-1"></span>2.3 SMART METERS

General meters have the primary function of regularly and precisely measuring the power flow into buildings. Their most common and old type is the electromechanical analogical meter. The more modern ones are integrated with digital microtechnology and are called smart energy meters, without mechanical moving parts [\(AVANCINI](#page-134-1) [et al.,](#page-134-1) [2019\)](#page-134-1).

The first generation of smart meters' main characteristic was to report consumption remotely to the power provider, which helped load-leveling the power network and reduce the human labor necessary to bill consumers. Different from analogical meters, smart meters can send information in short time intervals, like 15 min. Analogical meters only display the total consumption.

A smart meter must have at least one communication interface but might have more than one to ensure communication reliability. It might use Ethernet, power line, ZigBee, Wi-Fi, mesh, cellular, and other types of communication networks [\(AVANCINI](#page-134-1) [et al.,](#page-134-1) [2019\)](#page-134-1).

<span id="page-33-2"></span>A large number of smart meters must be efficiently handled since they generate large loads of data in the order of terabytes [\(AVANCINI et al.,](#page-134-1) [2019\)](#page-134-1). Because of that, smart grids need an infrastructure with data centers, servers, storage, database, and virtualization systems to handle these data.

# **2.3.1 Smart meter usage and security concerns on decentralized energy markets**

The [\(AVANCINI et al.,](#page-134-1) [2019\)](#page-134-1) authors consider it feasible to estimate household characteristics from the information captured by smart meters. How many occupants, how long each occupant stays at home, how many electronic devices are there, and the presence of security systems are some of the information that can be estimated by analyzing data sent from smart meters.

This possible inferring on people's behavior represents a security vulnerability that must be considered when dealing with smart meter data. Otherwise, instead of helping energy consumers and producers, they could potentially cause harm.

Smart meters are part of many energy market types and indispensable on a decentralized one. They collect energy flow data, which is used to track the consumption/generation of each consumer/prosumer at a specific time interval.

The authors of [\(KAMAL; TARIQ,](#page-136-5) [2019\)](#page-136-5) researched how to provide security solutions on a smart meter infrastructure. They treated light-weight security algorithms as a requirement for this type of device, considering its low computational capabilities.

Those smart meter characteristics must be considered when conceiving an energy market design. If their role on the network overcomes their capacity, the decentralized market will not work.

### <span id="page-34-0"></span>2.4 SMARTDATA

SmartData is a standardized high-level [Application Programming Interface \(API\)](#page-16-11) that facilitates IoT-related application development. It gathers a set of relevant attributes regarding data measured by sensors as the unit, spatial location, timestamp, and reliability [\(MEDEIROS FRÖHLICH,](#page-137-2) [2018\)](#page-137-2).

Code [2.1](#page-34-1) demonstrate how SmartData is represented in [JavaScript Object Nota](#page-16-12)[tion \(JSON\)](#page-16-12) format. The field **version** determines if the device is stationary, in version "1.1", or moving, version "1.2". The metric is sensed by the device of identification **dev** and has a **value** related to a **unit**. An **uncertainty** degree about the data might be declared. The coordinates **x, y, z** express the measure absolute spatial location associated with a specific instant represented by timestamp **t**. **Version** "1.2" also supports the SmartData cryptographic **signature** [\(LISHA,](#page-137-3) [2020a\)](#page-137-3).

#### Code 2.1 – Smart Data fields

2 "version" : unsigned char

<span id="page-34-1"></span>1 {

3 "unit" : unsigned long



Figure [3](#page-35-0) presents the organization of the **unit** field. The **unit** bit 31 indicates whether the **value** is digital data - images, audio, switches, and buttons - or an [International System \(SI\)](#page-17-3) physical measure like temperature, acceleration, electric current, fluid flow, and others. Even though Code [2.1](#page-34-1) displays **value** as double, the bytes in it might store a 32-bit integer, a 64-bit integer, or a 32-bit float IEEE 754 [\(COMMITTEE,](#page-135-2) [2019\)](#page-135-2). The correct interpretation is indicated by the two **NUM** field bits. The **MOD** field determines whether the unit is directly described, represents the ratio of units, is in logarithmic scale, or represents a logarithmic ratio.

Figure 3 – SmartData unit field semantics

<span id="page-35-0"></span>

<span id="page-35-1"></span>

The bits 26 to 0 are divided into unsigned three-bit fields, each representing a [SI](#page-17-3) unit exponent that determines the SmartData unit as a whole [\(LISHA,](#page-137-4) [2020b\)](#page-137-4). The exponent ranges from -4 to 3 and can be calculated by Equation [\(1\)](#page-35-1). Figure [4](#page-36-0) provides an example of an encoded unit, with the first line showing this unit is represented as hexadecimal. The following lines have the unit binary representation and the discrimination of each field value.
The bits 31 to 27 indicate that the example measured data is from the [SI,](#page-17-0) encoded as a double IEEE 754, and the unit is directly described. In the interval of bits 26 to 0, all the exponents with the binary value '100' indicate the absence of that [SI](#page-17-0) unit since their value is equivalent to 4 in base ten arithmetic. Therefore, based on Equation [\(1\)](#page-35-0), their exponent is 0. In Figure [4,](#page-36-0) only the exponents  $m+4$  (meter) and s+4 (second) are different from '100', with exponents of, respectively, 1 and -1. This leads to the conclusion that the SmartData unit is a meter per second (*m*<sup>1</sup> ∗ *s* –1).

<span id="page-36-0"></span>

### Figure 4 – SmartData unit field example

Designed by author

## 2.5 HYPERLEDGER FABRIC

In this Section, we explain the key concepts of the Hyperledger Fabric network. We intend to give a solid idea about how the network works without bringing all the details, which can be found in Hyperledger Fabric's documentation [\(TEAM, F. D.,](#page-138-0) [2020a\)](#page-138-0). We first present the network elements separately. Then in Section [2.5.10,](#page-43-0) we summarize how all those elements work together.

For more practical information on the tools used to implement Hyperledger Fabric and how to start a Fabric network refer to Chapter [5.](#page-60-0) In this Chapter, we focus on the theoretical architecture and principles.

# **2.5.1 Main differences between Ethereum and Bitcoin**

Hyperledger Fabric's main differences to platforms like Ethereum and Bitcoin are the **permissioned** structure and distributed transaction execution. In Hyperledger Fabric, the transaction can be validated by only some peers, whereas in Ethereum, all peers validate the transactions.

At first glance, this validation process might seem insecure, but we must remember that in Hyperledger's model, there is some implicit trust among network participants. Also, the workload of validating transactions can be distributed more efficiently, increasing the network's throughput, because only a subset of peers can

be required to validate each transaction.

Another difference is the way Fabric stores data. For this purpose, Fabric has two components: the ledger and the World State. The ledger is simply the log of all transactions performed in the network. For example, if an asset was first owned by User1, transferred to User2, and finally sent to User3, all these transactions are registered in the ledger.

The World State only stores the current valid network state. Considering our asset transfer example, the only information present in the World State would be that User3 owns the asset. No information about previous owners would be stored in the World State.

# **2.5.2 Network architecture**

<span id="page-37-0"></span>Figure [5](#page-37-0) displays a complete Hyperledger Fabric version 2.3 network containing the main stakeholders. The blockchain core elements are inside the **N** frame, with peers, orderers, smart contracts, and configurations. Outside the blockchain core, applications and certificate authorities participate in the network.



Figure 5 – Hyperledger Fabric network

Source: [\(TEAM, F. D.,](#page-138-0) [2020a\)](#page-138-0)

- **N**: Network
- **R1, R2, R3, R4**: Organizations represented by different colors
- **CA1, CA2, CA3, CA4**: Certificate authorities
- **NC4**: Network configuration
- **O4**: Orderer
- **C1, C2**: Channels
- **CC1, CC2**: Channels' configuration
- **P1, P2, P3**: Peers
- **L1, L2**: ledgers
- **S5, S6**: Smart contracts
- **A1, A2, A3**: Applications

### **2.5.3 Organizations**

Organizations represent a company, a group of people, or a set of machines. Each member of an organization has their membership validated by Certificate Authorities. In Figure [5,](#page-37-0) there are four Certificate Authorities (CA1, CA2, CA3, CA4), one for each organization, even though different organizations may use the same Certificate Authority. We must remember that Hyperledger Fabric enables a **permissioned** network in which different members have different roles and permissions. The Certificate Authorities have a key role in helping the permission identification of each network user.

### **2.5.4 Network administration and configuration**

The network can be configured to have multiple administrators since creation. However, in Figure [5,](#page-37-0) only the **R4** organization created the network, and it can add other nodes to manage the network and participate in network policies definition. We can see that just above the **NC4**, there are the organizations **R4** and **R1**. In this scenario, **R4** was the initial network creator and added **R1** as an administrator afterward.

## **2.5.5 Peers**

Peers are members of organizations that can interact with the network and might host ledgers and smart contracts. In Figure [5,](#page-37-0) they are represented by **P1, P2**, and **P3**. Applications (**A1, A2, A3**) hosted outside the network must interact with the network ledger and contracts through a peer. A peer can participate in multiple channels, which will be explained in Section [2.5.8.](#page-39-0)

Information is transmitted among peers through a gossip protocol that continuously discovers other peers, keeps block synchronism, and updates ledger data while maintaining speed. Every organization has a gossip **leader** that communicates to the ordering service to pull blocks [\(PROJECT,](#page-138-1) [2020\)](#page-138-1). The leadership can be static or dynamically established through elections. If the current leader stops sending heartbeats, a new election starts.

Every organization also has at least one anchor peer declared in the channel configuration. Anchor peers have information about all peers from the same organization and are responsible for passing it to other organizations. For example, assuming that Figure [5](#page-37-0) omits a peer **P4** from organization **R3** and **P3** is an **R3** anchor peer, **P3** will inform **P2** about **P4's** existence if they gossip. Otherwise, peers from different organizations would never gossip or know about one another's existence.

A Hyperledger Fabric peer can have two types of assignments in the network:

- **Committing peer**: A node that receives blocks from the orderer validates and commits them to its local ledger. Every peer is a committing peer.
- **Endorsing peer**: A node that hosts a smart contract and endorses transactions sent by client applications (This type of peer is further explained in Sections [2.5.8.1](#page-40-0) and [2.5.8.2\)](#page-40-1).

# **2.5.6 Orderers**

Orderers are responsible for enforcing the consensus on the network. They receive transactions from applications and form blocks sent to peers, resulting in the network consensus since the same block will be replicated in every peer. The ordering service acts according to the NC (Network Configuration) file.

The orderers participate in one common channel, called syschannel, to order the blocks. Before each orderer is initialized, they usually receive a *genesis block* file built based on the NC (Network Configuration) file. The information about certificates, organizations, consortiums, and orderers' hosts is in the genesis block.

## **2.5.7 Consortium**

A consortium is defined as a set of network members who need to transact with one another. In Figure [5,](#page-37-0) it is possible to see two consortiums. One is formed by **R1** and **R2**, while **R2** and **R3** form the other consortium. All consortiums must be defined by network admins in the Network Configuration file, represented by **NC4** in Figure [5.](#page-37-0)

### <span id="page-39-0"></span>**2.5.8 Channel**

After the consortium's creation, it is possible to set up a channel for its members. The channel serves as a private communications mean among the consortium's participants. There is one individual ledger to each channel. Only peers from the channel's organizations can host and execute smart contracts.

We can verify these characteristics in Figure [5](#page-37-0) by looking at the organizations' and peers' colors. In channel **C1**, peer **P1** is a member of organization **R1**, and peer **P2** is a member of organization **R2**, as they match colors.

Only channel members can define the channel configurations through the Channel Configuration file, represented by **CC1** and **CC2** in Figure [5.](#page-37-0) Channel admins can decide dynamically what ordering nodes can participate or must abandon the channel blocks' ordering.

### <span id="page-40-0"></span>2.5.8.1 Smart Contracts (Chaincode)

Smart contracts are programs that enforce rules and business models while members transact in the network. These contracts receive transaction requests with inputs and may reply to the requester or modify the ledger. In Hyperledger Fabric version 2.3, each smart contract might be programmed in Go, JavaScript, and Java programming languages.

The chaincode is formed by a set of smart contracts. A peer can host multiple chaincodes, such as one for channel **C1** and another for channel **C2**. It is also possible that the same chaincode can modify multiple ledgers, if multiple channels host it.

The smart contracts within the same chaincode share the same State, or, for better understanding, the same "memory space." Suppose a smart contract A within the same chaincode as smart contract B writes to the variable C. In that case, the smart contract B can also access variable C. Even though it is possible to have two or more smart contracts in a chaincode, the most common practice is to put only one smart contract for each chaincode.

### <span id="page-40-1"></span>2.5.8.2 Transactions and Policies

Hyperledger Fabric does not require that every peer validate every transaction. Instead, the validation process follows the endorsement policy. Let us consider the following scenario in Figure [6.](#page-41-0) An external application, **A1**, wants to call a smart contract function that performs a simple change in the World State. The **C1** channel's endorsement policy states, "every transaction must be signed by at least **two** peers to be considered valid."

To effectively call the smart contract function, the external application will have to send the transaction proposal to **two** different peers (**P1** and **P2**). The peers will receive the proposal, simulate the transaction, and sign a response with the resulting World State change.

After collecting all signatures, the application sends the transaction to the ordering service **O4**. When **O4** decides to form a new block for channel **C1**, **O4** will propagate the block for **P1** and **P2**. Then, finally, the peers will modify their local ledgers and the World States, after checking the transaction validity.

Every transaction has a Read/Write key set, informing the read and modified states. A transaction might be invalidated because some read state was modified by

another transaction ordered before. As an example, consider that transaction A reads state  $X$  and writes to state Y. Simultaneously, transaction  $B$  modifies  $X$ . If transaction B reaches the orderer before transaction A, then transaction A will not be validated because it read the old X value. We elaborate on the ordering service block creation in Section [2.5.9.](#page-41-1)



<span id="page-41-0"></span>Figure 6 – Hyperledger Fabric network with a **single** channel

Source: [\(TEAM, F. D.,](#page-138-0) [2020a\)](#page-138-0)

## 2.5.8.3 Private data collection

Private data collection allows private transactions among members of the same channel without creating a new one. The *transaction* flow for private data is different from regular transactions. First, the client application sends the proposal for the endorsing peers (private data collection peers), which endorse the transaction, save the transaction result in a temporary data store and respond with a signed proposal. The proposal only contains hashes about private data keys and private data values.

The client application forwards the endorsed proposal to the orderer. When a new block is created, the private data collection peers will either apply the change saved in the temporary data store or fetch the data from another peer.

## <span id="page-41-1"></span>**2.5.9 Consensus**

The [PoW](#page-16-0) consensus, used by Bitcoin and Ethereum, is not deterministic due to the lack of guarantee that a mined block will be accepted as the next block by the whole network. In other words, there is the possibility of chain **forks** happening. A fork occurs when two miners generate two different valid blocks simultaneously, and the network's nodes are not clear on which one should be considered the next block. Usually, forks are resolved by waiting for further blocks to be added to the chain. The longest chain is considered the correct one.

In Hyperledger Fabric, there is no such complexity since the consensus process is deterministic. This is achieved through tools like **Raft** and **Kafka**, executed by the **orderers**. Both tools are crash fault-tolerant and meant for environments with certain trust among stakeholders.

**Raft** is the recommended consensus in Hyperledger Fabric version 2.0, as **Kafka** is deprecated. Both tools have a leader and follower architecture. In section [2.5.9.1,](#page-42-0) we describe the consensus idea, and in section [2.5.9.2,](#page-42-1) we describe how **Raft** enables this consensus idea.

### <span id="page-42-0"></span>2.5.9.1 Consensus general idea

Considering a network with four orderers, each orderer receives endorsed transactions from applications, and the received transactions set will probably vary among the orderers. Because of that, they must have a process to agree on the transaction sequence of the next block.

To ensure consensus, Hyperledger Fabric orderers follow a leader/follower protocol. The four orderers must elect a leader, and the remaining three orderers are classified as followers. The followers send their received transactions to the leader, and the leader decides on the transaction order of the next block. After that, the followers receive the next block from the leader and send it to peers.

When peers receive the new block, they validate each transaction following the endorsement policy and considering the World State modifications. Every peer follows the same validation process, which ensures that the ledger changes are the same.

All Hyperledger Fabric current consensus implementations are crash faulttolerant (CFT) but not Byzantine fault-tolerant (BFT). A CFT consensus guarantee that the network will function even if some nodes crash, while a BFT consensus guarantee network normal function even if some nodes act maliciously [\(PODGORELEC](#page-138-2) [et al.,](#page-138-2) [2019\)](#page-138-2)

## <span id="page-42-1"></span>2.5.9.2 Raft

Raft is also a crash fault-tolerant consensus tool for the Hyperledger Fabric, and, different from Kafka, which Apache implements, Fabric has its native implementation of Raft. It follows the leader/follower architecture, and it is embedded into each orderer.

All nodes start as followers. If a node does not receive a heartbeat or blocks from the leader after some time, it enters the candidate state when a node asks other nodes for votes. If the candidate collects enough votes to satisfy the channel quorum, it is considered a leader. In the case of a leader crash, another leader is elected by the same steps.

Figure [7](#page-43-1) shows the raft election beginning with four nodes. Each Raft node represents a single orderer. Node D and Node C have the timeout expired at the same <span id="page-43-1"></span>moment. The green circles represent vote requests sent to other nodes.



Figure 7 – Raft election example

Source: [\(DATA,](#page-135-0) [2020\)](#page-135-0)

After the election, all transactions received from client applications by followers are routed to the leader. After some time or after a collected transaction quantity, the leader orders transactions, forms a block and sends the block to followers. The followers and the leader forward the new block to the peers.

Each channel selects a consenter set of orderers. There is one instance of the Raft protocol **for each channel**, which implies one different election, one different leader, and a separate consensus. Even though this design choice might seem unnecessarily expensive, the designers claim that it represents the first step for achieving a future Byzantine fault-tolerant consensus in Hyperledger Fabric [\(TEAM, F. D.,](#page-139-0) [2020d\)](#page-139-0).

## <span id="page-43-0"></span>**2.5.10 Summarizing**

First, a node creates the network by defining a Network Configuration file and instantiating an ordering service. Other nodes are added following the Network policies and are always associated with a Certificate Authority. When already in the network, two or more organizations are free to create a consortium associated with a channel. Only the members of the channel define its policies in the Channel Configuration file. They decide who can interact with the ledger by reading and writing. Also, they decide policies for administration, ordering, and endorsement.

For example, the channel's administrators might decide that each transaction will require at least half of the peers' signatures. Peers in the network can install a chaincode, which serves as a container for related smart contracts. Nodes can communicate privately using Private Data Collection within the same channel, and only private data hash is published publicly to the channel.

When channels begin to generate transactions and data, the orderers group them and assemble blocks. The orderers know nothing about the transaction semantics, as they only verify the endorsement policy and assemble blocks for each channel to achieve consensus.

We presented the most common action flow in a Hyperledger Fabric network, but many other configurations are possible since the network is very modular. For example, in Fabric's version 2.3, the channel admins can decide what orderers participate in the channel, even though Figure [5](#page-37-0) shows only a single orderer.

## **2.5.11 Idemix - identity mixing**

Hyperledger Fabric supports zero-knowledge proof transactions with idemix. Zero-knowledge proof lets a prover  $P$  convince a verifier  $V$  that  $P$  knows a secret without explicitly exposing the **secret** [\(CAO; WAN,](#page-135-1) [2020\)](#page-135-1). V makes random requests with some parameters for  $P$  to perform calculations and reply with the result. After some rounds of successful requests and answers between P and V, V decides that it is highly probable that P knows the **secret**.

Idemix, briefly mentioned by [\(CAMENISCH; LYSYANSKAYA,](#page-134-0) [2004\)](#page-134-0) and specified by [\(AU et al.,](#page-133-0) [2006\)](#page-133-0), allows that applications transact anonymously in the network. Each organization must define whether it signs with default x509 or idemix. However, the downside of using idemix is that organizations cannot endorse transactions or approve chaincode definitions. Therefore, idemix organizations also cannot have active peers or orderers.

Ideally, a network should have as few idemix organizations as possible because some policies require that most organizations sign a change. If half of the organizations have idemix, changes will be hindered. Idemix provides a way to make all transactions by the same entity unlinkable to one another. To accomplish that, Hyperledger generates a new pseudonym to sign every new transaction. Overall, it is a useful tool if the network requires anonymous transactions from applications.

## **3 LITERATURE REVIEW**

The following questions drove this literature review:

- What are the current solutions presented in the literature about blockchain energy trading?
- What are the limitations of the current schemes?

We performed a search on IEEE (Institute of Electrical and Electronics Engineers) through the query in Frame [1.](#page-45-0) We selected the 18 most relevant papers to be analyzed through abstract and full-text reading. Two papers were immediately rejected. One of them was rejected due to having a publication date before 2018, and the other because its main focus was vehicular energy trading. We read the remaining 16 papers, plus the other eight relevant works cited by these 16 since their content complemented some aspects not covered by the ones found by query results. We assessed the full text of these 24 papers and selected the most related to our proposal.

### Quadro 1 – Research query

<span id="page-45-0"></span>"All Metadata":"Blockchain" AND "All Metadata":"energy" AND ("All Metadata": "trade" OR "All Metadata":"trading")

The authors of [\(PEE et al.,](#page-138-3) [2019\)](#page-138-3) propose a decentralized energy trading scheme enabled by an ESS (Energy Store System), with the price set by the [DSO](#page-16-1) (Distribution System Operator). Sellers and buyers inform the energy amount to be sold or bought, and an Ethereum smart contract performs the matching. The work provides a general idea of a blockchain energy trading system. However, it is far from meeting the real world's needs due to its simplicity and not mentioning scalability and privacy.

[\(KANG et al.,](#page-136-0) [2018\)](#page-136-0) also proposes a blockchain energy trading solution using Ethereum. A contract is created and deployed on the blockchain for each energy transaction between consumer and prosumer. The consumer calls a function from the deployed contract offering a bid to the prosumer. When there is a match between bids, the energy is transferred, and the payment is performed. Even though the last cited work admits to being only a starting idea, it is interesting to mention its weaknesses. There is no market clearing process, and each transaction requires a new contract, which is unnecessary in terms of storage usage. The solution uses a consensus method like [PoW](#page-16-0) in a private Ethereum network, whereas the authors could have taken advantage of the privacy and use a lighter consensus algorithm.

In [\(LU et al.,](#page-137-0) [2019\)](#page-137-0), a blockchain-based energy trading scheme is designed with

two layers. The first layer consists of a private blockchain to support local energy trading in a community context. In the second layer, regional energy aggregators trade energy cross-regionally. The energy aggregators are also responsible for coordinating the transactions locally, acting as a third-party manager.

The work proposes a Proof-of-Stake consensus method based on each node's credit score, and tokens signed by aggregators serve as energy credits to be consumed. The authors performed a mathematical analysis of their system performance, and they did not mention any blockchain tool. Payment off-chain and mixing private and consortium blockchains are considered as solutions to protect user privacy. They suggest improving scalability and performance as to future work.

The proposal in [\(HUSSAIN et al.,](#page-136-1) [2019\)](#page-136-1) describes a blockchain solution for energy trading between the [DSO/](#page-16-1)Ancillary Services and their clients only. It does not enable [P2P](#page-16-2) energy trading, while it recognizes that [P2P](#page-16-2) trading's complete implementation still faces challenges. The authors advocate using permissioned blockchain tools like Enterprise Ethereum and Hyperledger Fabric in energy schemes, as they allow more efficient consensus algorithms like [PoA](#page-16-3) and [Proof-of-Stake \(PoS\).](#page-16-4) Lighter consensus methods are more suitable for constrained smart meters.

An Ethereum smart contract is presented. Each new block is added by authorized nodes using [PoS](#page-16-4) consensus with grades calculated from past network behavior. The authors argue that blockchain can mitigate smart meters' communication security vulnerabilities. As a future direction, the work indicates the implementation of a fully decentralized energy trading system.

The authors of [\(ALAM, A. et al.,](#page-133-1) [2019\)](#page-133-1) suggest a double-chained blockchain energy trading scheme. One chain stores smart contracts that report the power status of a user, and the other chain enables energy negotiation. The work argues that a decentralized blockchain energy trading scheme provides cyber resilience, eliminates monopoly, is transparent, and provides security. Research on optimizing the consensus and protecting the network against DoS (Denial of Service) is mentioned as future work. The paper describes only a generic blockchain energy trading scheme.

On [\(DORRI et al.,](#page-135-2) [2019\)](#page-135-2) proposes a [P2P](#page-16-2) energy trading scheme through an Ethereum private blockchain. On the scheme, the producer pays or requests for the network authorities to join the network. Once in the network, the producer deploys a smart contract to keep their price and available energy amount updated. The consumer performs a Commit to Pay transaction, putting the money on hold until the producer releases the energy. When energy is delivered, the consumer/buyer informs the network through an Energy Receipt Confirmation, and the funds are transferred to the producer. Transaction fees reward the block miners and serve as an incentive.

The authors present a proof-of-concept with two Raspberry Pi, using a Python extension to interact with the Ethereum blockchain and using Ether cryptocurrency

as a payment method. They evaluated the system behavior with reliable and unreliable nodes. The authors also presented performance metrics like end-to-end delay, monetary cost, transaction throughput, and blockchain size.

The work of [\(KODALI et al.,](#page-137-1) [2018\)](#page-137-1) presents a blockchain [P2P](#page-16-2) energy trading scheme implemented with Hyperledger Fabric. It considers three main stakeholders: energy nodes, energy aggregators, and smart meters. Residents can trade with the utility [\(DSO\)](#page-16-1) or with other residents. The architecture has its own coin that can be converted to fiat money. The energy aggregator acts as a broker and manages the trades. Even though the scheme is not very detailed, the work describes and classifies different Hyperledger services. Fabric, Iroha, and Sawtooth are compared with each other in consensus algorithm, consensus approach, and advantages.

The paper [\(WANG, S. et al.,](#page-139-1) [2019\)](#page-139-1) brings a more detailed description and a more in-depth analysis of blockchain decentralized energy markets if compared to the previously described papers. It shows a market structure closer to real centralized solutions like Nordpool [\(POOL,](#page-138-4) [2020\)](#page-138-4). The market is split into two phases: the dayahead and the real-time market, explained in Section [2.1.2.](#page-27-0)

In their system, prosumers are classified as Type 1 or Type 2. Type 1 prosumers submit entirely to the power operator [\(DSO\)](#page-16-1), and negotiations between them occur in the day-ahead market. Type 2 prosumers can trade with the [DSO](#page-16-1) and between each other, but only in the real-time market. Since the authors' predominant areas are electrical and electronic engineering, the scheme focuses on Optimization Power Flow (OPF) solution and energy distribution.

They chose Hyperledger Fabric as an implementation tool because it met their requirements. The authors wanted a permissioned chain restricted to consumers/prosumers within the distribution area, efficient smart contract execution, practical consensus, and a model that protected users' privacy. It is essential to highlight that they did not consider any other privacy protection mechanism beyond simply using Hyperledger Fabric. Even though they propose a decentralized market system, the [DSO](#page-16-1) still plays a central authority role.

In [\(JEON; HONG,](#page-136-2) [2019\)](#page-136-2), the blockchain energy trading model introduces sidechains (Plasma and Plasma Cash) on Ethereum to solve scalability problems and address smart meter computational constraints. Smart meters act as automated agents to trade energy. The energy trading process between microgrid's participants happens on the side-chain, and the Merkle root of each block on the side chain is published in the main chain (Ethereum main net).

There is a centralized operator responsible for managing the side-chain. The authors cite higher throughput, reducing main net use, and the reliance on the main net as major advantages for their model. They claim that future research should design real use cases of microgrid energy trading.

The authors of [\(HUANG et al.,](#page-136-3) [2019\)](#page-136-3) focus on the blockchain energy trading system's [IoT](#page-16-5) part. They propose a proof-of-concept with Sigfox for smart meter communication and Ethereum as the blockchain tool. On their solution, smart meters send information and requests directly to the Sigfox Cloud, and blockchain miners are responsible for retrieving the data and publishing it on the chain.

The main contribution of [\(HUANG et al.,](#page-136-3) [2019\)](#page-136-3) is on [IoT](#page-16-5) communication. They tested the Sigfox technology communication range and concluded that in a 1 km range, the Sigfox delivery success rate was 100%. The integration with the blockchain part of the system is mentioned as future work.

The Master thesis presented by [\(BLOM,](#page-134-1) [2018\)](#page-134-1) evaluates the feasibility of a blockchain energy trading system. It covers aspects like motivations for adopting such a system, (Norwegian) regulation, required infrastructure, challenges, desired blockchain characteristics, and implementation. The market design was divided into three parts: day-ahead, real-time, and load curtailment. The market clearing is performed off-chain by a node and verified on-chain.

The three market parts were simulated with Ethereum smart contracts, which are published on Github. The day-ahead simulation and real-time markets were simulated with 600 nodes, while the load curtailment market was simulated with 25 nodes. The author analyzed the cost of the system based on the gas spent by all transactions.

Finally, the author classifies eight statements about the proposed scheme feasibility as true, false, or probable. The conclusion briefing was that the feasibility could not be proven, but some good evidence indicates that decentralized [P2P](#page-16-2) blockchain energy trading is feasible. The work gives explicit and implicit future directions. Some are listed below.

- Perform tests on blockchain platforms other than Ethereum.
- Test the proposed system with real computers and smart meters.
- Propose privacy-preserving schemes for the blockchain energy market.
- Improve network scalability.

A privacy scheme with [Multiparty Computation \(MPC\)](#page-16-6) is presented in [\(ABIDIN](#page-133-2) [et al.,](#page-133-2) [2018\)](#page-133-2). Their algorithm design is based on blockchain energy trading models, but the solution was implemented in C++ and was never tested in a blockchain environment. The authors affirm that the simulation performed with real energy data from Belgium indicates that the solution is feasible in a blockchain tool. The authors also present performance metrics regarding CPU operations, and their protocol was analyzed in security aspects with the Universal Composability framework. Optimizing the [MPC](#page-16-6) implementation is mentioned as future work.

The work [\(AHL et al.,](#page-133-3) [2020\)](#page-133-3) analyzes blockchain use in the energy sector regarding technology, economy, society, environment, and institutions in the Japanese context. The authors mention blockchain's technological challenges when applied to energy markets. Throughput, latency, storage, security are some of those challenges. Multi-chain communication, side chains, and off-chain storage are considered solutions for scalability problems.

A case pilot project in Misono, Japan, is presented with ten consumers, five prosumers, and one mall. The stakeholders exchange energy through a blockchain network and three possible power lines. They are equipped with solar panels, batteries, smart meters, and communications systems to interact with smart meters and the blockchain energy market. The chosen platform was Ethereum, with a [PoA](#page-16-3) consensus.

The authors also affirm that privacy measures, such as pseudonymity, are critical next steps in the blockchain and energy integration context. Other research opportunities are enumerated: consensus mechanisms development, sharding, state channels, smart meter blockchain integration (via light clients), and privacy measures.

Our work proposes, implements, and validates an energy trading scheme in Hyperleder Fabric. We ensure the buyers' privacy through identity mixing and analyze the implementation throughput and data generation rate to elucidate the proposal's scalability. Buyers and sellers can exchange only validated energy generated in the past. The chaincode judges the energy generations as valid based on sensors measures periodically published to the chain. Our model considers the participation of utility companies and payment companies to settle the payment of anonymous buyers.

In table [1,](#page-50-0) we compare the related work characteristics. Cells filled with an  $X$ represent that the work has such characteristics. In the case of [\(BLOM,](#page-134-1) [2018\)](#page-134-1), the X in the Hyperledger column indicates that Hyperledger was widely discussed, even though the solution was implemented using Ethereum.

The columns with a symbol like " $\bigcirc$ " indicate how deeply the work addressed such topics and the quality of their solution for each topic. The symbol " $\bullet$ " represents maximum depth and quality, while " $\circ$ " represents the lowest depth and quality. For example, [\(KANG et al.,](#page-136-0) [2018\)](#page-136-0) propose a simple blockchain energy market model and do not cover some stakeholders, like the utility company. They do cover a context with only prosumers and consumers. However, the model of [\(BLOM,](#page-134-1) [2018\)](#page-134-1) supports three types of energy markets and considers the utility company. Therefore, in the **Depth of market design** topic, [\(KANG et al.,](#page-136-0) [2018\)](#page-134-1) is rated " $\circ$ ", while [\(BLOM,](#page-134-1) 2018) is rated  $" $\odot$ "$ .

<span id="page-50-0"></span>

<b>Characteristics</b> <b>Related work</b>	Permissioned	Deals with privacy	Deals with scalability	Implemented	Ethereum	Hyperledger	<b>ODepth of market design</b>
(PEE et al., 2019)	X	$\bigcirc$			X		
(KANG et al., 2018)	X.	$\bigcirc$		X	X		$\overline{\mathbb{O}}$
(LU et al., 2019)	$\sf X$	$\overline{\textcircled{\circ}}$	$\bigcirc$				$\overline{\bigcirc}$
(HUSSAIN et al., 2019)	X	$\bigcirc$			X		$\overline{\mathbb{O}}$
(ALAM, A. et al., 2019)							$\bigcirc$
(DORRI et al., 2019)	X	$\bigcirc$	$\bigcirc$	X	X		$\bigcirc$
(KODALI et al., 2018)	$\sf X$	$\bigcirc$	$\bigcirc$			X	$\overline{\bigcirc}$
(WANG, S. et al., 2019)	$\sf X$	$\overline{\bigcirc}$	$\overline{\bigcirc}$	X		X	$\overline{\bigcirc}$
(JEON; HONG, 2019)	X	$\bigcirc$	$\bigcirc$		X		$\bigcirc$
(HUANG et al., 2019)		$\bigcirc$	$\bigcirc$		X		$\bigcirc$
(BLOM, 2018)	X	$\overline{O}$	$\bigcirc$	X	$\mathsf{X}$	X	$\overline{\bigcirc}$
(ABIDIN et al., 2018)		$\bigodot$					$\bigcirc$
(AHL et al., 2020)	$\sf X$	$\bigcirc$	$\bigcirc$		X		$\bigodot$
This work	X	$\bigodot$	$\bigodot$	X		X	$\bigodot$

Table 1 – Related work comparison

The work (AHL et al., 2020) was included based on the relevance of its experiments, and it did not come from the review process. Thus, we decided to add the work in this section to serve for further base and comparison with our model.

## **4 BLOCKCHAIN ENERGY TRADING AND VALIDATION MODEL**

We defined a blockchain energy trading model to perform experiments regarding scalability, privacy, and traceability - which are the topics of our research questions. The model is implemented using Hyperledger Fabric, and it will be presented in this Chapter.

## 4.1 MODEL'S LITERATURE MOTIVATION

The work presented in [\(WANG, N. et al.,](#page-139-2) [2019\)](#page-139-2) surveyed blockchain energy trading schemes and listed the main challenges of those systems. Among the challenges are low efficiency, privacy protection, and scalability issues. The authors claim that avoiding statistical predictions and behavior model analysis while preserving nodes' rights and interests in the network may be a severe challenge.

On [\(JOHANNING; BRUCKNER,](#page-136-4) [2019\)](#page-136-4), the authors evaluate the whitepapers of blockchain-based peer-to-peer energy trading projects. They analyzed the projects' characteristics, transaction elements, and energy ecosystem. The conclusion was that most of the evaluated projects were described too macroscopically and that future research must address this topic with more scientific depth.

Table [1](#page-50-0) shows that there is still much improvement room in the blockchain energy trading schemes in terms of privacy, scalability, and market design based, on our literature review. In our model, we address these three research gaps: privacy, scalability, and market design.

## 4.2 ENTITIES AND THEIR ACTIONS

Our model consists of a blockchain network that aggregates five entities: **sensors**, **energy sellers**, **energy buyers**, **validators**, and **payment companies**. Each one is entitled to perform their actions by calling different functions on a **chaincode** (smart contract) related to their roles. Figure [8](#page-52-0) presents the main actions of each network entity. Their actions will be described and explained in Sections [4.2.1,](#page-51-0) [4.2.2,](#page-52-1) [4.2.3,](#page-53-0) [4.2.4,](#page-53-1) and [4.2.5,](#page-54-0) introducing their behavior in our model.

## <span id="page-51-0"></span>**4.2.1 Sensors**

The sensors capture environment metrics and publish them to the blockchain network - action **1** in Figure [8.](#page-52-0) They can measure temperature, luminosity, humidity, wind speed, air pressure, electric current, and other relevant energy generation metrics. The sensors data is used to validate the energy sellers' generation claims action **3.2** in Figure [8.](#page-52-0) This process is described in further detail in section [4.2.4.](#page-53-1)

Each sensor is registered to network with their spatial coordinates, which en-

<span id="page-52-0"></span>

Figure 8 – Model entities and their actions

Designed by the author

able the network to infer an environment metric in a specific location in a specific time window. With data coming from many different sensors around a location, the network mitigates the attack of a sensor, intentionally or not, sending incorrect measurements to induce improper behavior.

# <span id="page-52-1"></span>**4.2.2 Energy sellers**

Energy sellers generate a specific energy type - solar, wind, hydroelectric or other - and publish their energy generation in the blockchain by invoking a chaincode function - action **3.1** in Figure [8.](#page-52-0) They might be prosumers or local energy generation companies. The energy generation claims are validated before the energy amount is available for selling.

After the validation, sellers might publish sell bids so that buyers can match it - action **3.3** in Figure [8.](#page-52-0) The buyer's payment company is responsible for paying the seller after the auction - actions **6** and **9** in Figure [8.](#page-52-0)

**Observation**: our model does not define the organization responsible for registering buyers and sellers. We assume that the registering role could be done by regulators or utility companies.

## <span id="page-53-0"></span>**4.2.3 Energy buyers**

Energy buyers use the network to buy a desired type of energy. For example, they might be concerned about pollution and want to buy only solar or wind energy. Since the network validates each energy bid, buyers have assurance about the origin of the energy they buy. The energy buyers prove to their energy distribution company that they bought energy in the network and receive discounts on electricity bills.

For example, if the buyer acquires 10 [Kilowatt-hour \(kWh\)](#page-16-7) on Energy Network and their meter registers the total consumption of 50 [kWh,](#page-16-7) the utility company might charge only 40 [kWh.](#page-16-7) This is possible because the utility company trusts the blockchain network to verify the energy generation since the buyer proves to have bought energy through the network. Therefore, when a buyer proves ownership of the transaction that bought energy, the company accepts it.

The buyer's utility company knows that the buyer consumed 50 [kWh](#page-16-7) based on their smart meter reads. However, when the buyer presents the acquirement proof of 10 [kWh](#page-16-7) in the blockchain market to the utility company, it is only entitled to charge for the difference: 40 [kWh.](#page-16-7)

Buyers publish an **anonymous** buy bid with a token from a payment company - action **7** in Figure [8.](#page-52-0) With this token, only the payment company **might** know the buyer's identity while guaranteeing to the seller that they will be paid.

## <span id="page-53-1"></span>**4.2.4 Validators and validation**

Every time an energy seller publishes their energy generation to the blockchain network, validators use the sensors' data to judge whether the generation is legitimate. For example, a prosumer might have a solar panel that produces the maximum amount of 85 [kWh](#page-16-7) on a sunny day. If this prosumer publishes an 85 [kWh](#page-16-7) generation claim, but luminosity sensors near the prosumer indicate a cloudy wheater, the validators must reject the bid and not endorse it. Even if the prosumer's smart meter indicates that they are feeding the grid with 85 [kWh,](#page-16-7) they might try to trick the energy network by selling dirty energy as clean energy.

State regulators, transmission line owners, private regulators, big energy sellers, or others can perform the validator role. Validators indicate to the network the sensors they trust - action **2** in Figure [8.](#page-52-0) When an energy seller publishes an energy generation claim, the near trusted sensors help the claim validation - action **3.2** in Figure [8.](#page-52-0) A minimum number of validators are needed to endorse the energy generation claim.

Figure [9](#page-54-1) shows how sensors are selected in terms of location. Sensors have spatial coordinates and a relevance radius that indicates the area where the sensor's captured environment metric is equal or closely similar. The metric sensor unit must be related to the seller's energy type. For example, to validate a **solar** energy generation claim, sensors that measure wind speed should not be selected, but luminosity sensors should.

Our model does not define the precise rules and criteria for validating the energy based on the environment metrics captured by sensors, as it would require knowledge from the electrical engineering field. We only assume that such calculation is possible, and we represent it **symbolically** by averaging the sensors' data near the seller and multiplying it to a constant.

<span id="page-54-1"></span>

Figure 9 – Considered physical topology

Designed by the author

# <span id="page-54-0"></span>**4.2.5 Payment companies**

Payment companies are organizations in the network responsible for settling the payments, off-chain, between buyers and sellers. They receive funds from the buyers to send a token to compose the buy bid - actions **4** and **5** in Figure [8.](#page-52-0) This token represents a payment guarantee for the seller, who can withdraw the funds presenting proof of transaction.

As soon as the buyer publishes their buy bid, they must request the validation of their bid by the payment company. After the request, the payment company validates the buy bid - action **8** in Figure [8](#page-52-0) - by informing the network how much funds the token covers in the buy bid. If a buyer tries to publish a buy bid offering more funds than the payment company claims to cover, the network will not let the bid validation.

The validation avoids token theft and usage by a malicious user since there is no ownership information on the token. Without validation, a peer could read the token, reject the original buyer's transaction, and utilize the token to buy energy for a third party.

Even though the token could be digitally signed by the payment company and reference the buyer credential to avoid the validation step, we opted not to add cryptography. A cryptographic token would create other problems, increasing the processing time due to cryptographic operations and decaying the model scalability. In these conditions, the token would need standardization across payment companies so that the chaincode could process it, increasing the chaincode's complexity unnecessarily.

## 4.3 ACTIONS FULL SEQUENCE

The sequence diagram presented in Figures [10](#page-57-0) and [11](#page-58-0) shows a possible action sequence performed by entities. All these actions would happen in a real deployed network, simultaneously with multiple sellers, buyers' payment companies, utility companies, and validators. However, the diagram clarifies the usual action sequence by each entity type.

First, each sensor declares itself active to the network and starts publishing its captured data. Following that, energy validators can define the sensor set they trust to be considered in their validation policy. As soon as the seller is registered, they or their automated gateway can publish energy generation claims. The chaincode judges the claims as valid or invalid based on the seller's location and the sensors' published data.

In case the energy generated is ruled valid, the seller publishes a sell bid. A buyer desires to match this sell bid, and they request a token from the payment company before sending a buy bid. The buyer sends the buy bid to the network and requests the bid validation to the payment company, which validates it. After that, the buy bid participates in the network double-auction and matches the sell bid.

The buy bids and the sell bids are matched, and the energy transactions are registered to the ledger. Proving the bids issuance, buyers and sellers might request, respectively, energy bill discounts and payment for the sold energy. The utility company and the payment company respond accordingly after verifying the proofs.

The utility company tries to charge the energy customer for the consumption amount indicated on their smart meter. Nevertheless, if the consumer bought some energy on the blockchain network, they require a discount on their bill after providing the necessary evidence. In the seller's case, they inform the payment token received after selling energy. The payment company verifies if the seller is the designated part of receiving the funds, and then the seller is paid.

<span id="page-57-0"></span>

Figure 10 – Sequence diagram (continues in Figure [11\)](#page-58-0)

Designed by the author

<span id="page-58-0"></span>

Figure 11 – Sequence diagram continuation

Designed by the author

### 4.4 MODEL MAIN CHARACTERISTICS

The proposed model increases trust in the energy sellers because their energy generation claim is verified by multiple regulators, utility companies, or other validators, based on many sensors' collected data. Buyers can have significant assurance on the bought energy origin. Every [kWh](#page-16-7) exchanged through the network can be mapped to the sensors that validated the generation.

Buyers can keep their anonymity while performing energy transactions to such an extent that network participants cannot infer the buyers' energy consumption patterns. Even though our model does not specify if the energy bought is consumed instantly, it might be, depending on the deployment context. In such a scenario anonymizing the buyer becomes essential.

In our model, energy sold has to be generated in the **past** to simplify and avoid energy delivery verification complexity. Thus, sellers do not correspond to a [Balance](#page-16-8) [Responsible Party \(BRP\),](#page-16-8) and they are not obliged to generate during a specific time window. This lack of responsibility might difficult for the utility companies to work to solve power imbalances. However, the vast amount of sensor data can serve as a counterbalance and, from another perspective, help to predict power imbalances.

Sell bids and buy bids can be partially matched, always generating energy transactions registering the energy quantity and settlement price. With that, buyers prove their ownership of the bought energy and request discounts on their energy bills. Sellers contact the payment company to receive the funds related to their transactions.

### 4.5 FURTHER MODEL DETAIL

Blockchains are heterogeneous and suit problems distinctly. Therefore, models' specificities depend on the selected technology. [\(CALDARELLI,](#page-134-2) [2020\)](#page-134-2) considers proposals that explicitly define the blockchain technology to be more grounded and realistic. Furthermore, they argue that building a hypotheses without defining the blockchain technology may hardly provide a concrete contribution.

For example, our model was designed based on the Hyperledger Fabric blockchain, which has an organization oriented architecture. Thus, the same model would not fit the Ethereum straightforwardly. For that reason, some further details of our model are described in Chapter [5,](#page-60-0) where we elaborate on the model implementation.

# <span id="page-60-0"></span>**5 PROPOSAL DEVELOPMENT**

In this chapter, we will explain the development of our proposal, which we separated into four main sections. Section [5.1](#page-60-1) presents the necessary steps and configurations to locally deploy a basic Hyperledger Fabric production network with a chaincode installed. Section [5.2](#page-72-0) focuses on our chaincode design by explaining the main data structs, some important design principles, and the reason for modifying Hyperledger Fabric.

Section [5.3](#page-86-0) explains how we utilized the adapted versions of fabric-sdk-java and fabric-gateway-java to implement applications for buyers, sellers, sensors, utility, and payment companies. Our experiments were performed fully inside the [AWS](#page-16-9) cloud infrastructure, and Section [5.4](#page-96-0) describes how we performed such deployment after adapting our local deploy scripts.

## <span id="page-60-1"></span>5.1 NETWORK LOCAL DEPLOYMENT

To develop and test our proposal, we had to deploy a Hyperledger Fabric network with organizations, peers, orderers, and applications. The Hyperledger Fabric network can be constructed in different ways [\(TEAM, F. D.,](#page-138-0) [2020a\)](#page-138-0). This section describes the general steps in network creation to provide enough understanding of our network development.

Hyperledger Fabric provides two alternatives for network deployment and testing: the **testnet** and **production networks**. The testnet is designed to run locally in a pre-defined network structure, with a couple of peers and a single orderer. It provides a simple and easy deployable environment so application designers can execute tests without deploying a production network, which is more complex.

The production network is the one used network in real environments. It allows the creation of as many peers, orderers, admins, and clients as defined. **All of our tests** are performed in a production network so that the results are closer to real applications.

## **5.1.1 Hyperledger Fabric general creation steps**

When we mention the term **client**, we refer to an application outside the network, as presented in Chapter [2.](#page-26-0) The organization **member** represents the generalization of organization admin, client, orderer, or peer. The general steps for network creation are:

<span id="page-60-3"></span><span id="page-60-2"></span>1. (Optional) Create one root [Certificate Authority \(CA\)](#page-16-10) for each organization using the fabric-ca-server tool.

- 2. (Optional) Create one [Transport Layer Security \(TLS\)](#page-17-1) [CA](#page-16-10) for all organizations using the fabric-ca-server tool.
- 3. Generate two certificates for each organization member. One certificate only to handle for [TLS](#page-17-1) communication purposes and the other as identification of organization Membership Service Provider [\(MSP\)](#page-16-11).
- 4. Set the desired initial configuration for the network in a configuration file configtx.
- <span id="page-61-0"></span>5. Generate the System Channel genesis block with information about the organizations in the network, the certificates of all [CAs](#page-16-10) involved, and the certificates of organization administrators.
- 6. Initialize the orderers with the genesis block created in step [5.](#page-61-0)
- 7. Initialize peers.
- 8. Organizations' admins create channels for the consortiums defined in the configuration file configtx.
- 9. Organizations' admins command their peers to join channels.
- 10. Organizations' admins install the desired chaincodes on peers.
- 11. Channel admins approve the chaincodes for the channel by collecting at least N signatures, defined in the network configuration file.
- 12. After enough approvals are collected, the chaincode is committed by a single channel admin.
- <span id="page-61-1"></span>13. (Optional) A channel admin calls the init (initialization) function on the chaincodes.

Steps [1](#page-60-2) and [2](#page-60-3) are optional as they do not necessarily need to be created because existing [CAs](#page-16-10) could be used. Not all chaincodes require an initialization function. That is why step [13](#page-61-1) is optional.

## **5.1.2 Environment with docker images**

In a production network context, Fabric [CAs](#page-16-10), peers, and orderers are docker containers with images available to be downloaded in Docker Hub [\(INC.,](#page-136-5) [2020\)](#page-136-5). A typical deployment procedure consists of defining all [CAs](#page-16-10), peers, and orderers in a docker-compose file, where the image version and environment variables are defined.

Since we performed modifications on Hyperledger Fabric, the docker images had to be recompiled locally. Thus, the docker images mentioned in this chapter were not fetched from the docker hub, and **nothing** in our implementations can be replicated with the default Hyperledger Fabric docker images.

Code [5.1](#page-62-0) shows an example of how to set the orderer configurations in a *docker*compose file. After properly setting the docker-compose.yml, calling the command in Code [5.2](#page-62-1) starts an orderer. Every **chaincode** is also a docker container, but they are started by the peers with chaincodes installed. These containers can be deployed in the same physical machine or multiple machines across different networks. Our initial tests were performed by deploying all containers in the same physical machine.



<span id="page-62-0"></span>



```
1 $ docker-compose -f docker-compose.yml up -d orderer
```
## **5.1.3 Network configuration files**

This section will explain the purpose of each configuration file and how they change network behavior. All configurations are formatted in file format [YAML Ain't](#page-17-2) [Markup Language \(YAML\)](#page-17-2) [\(BEN-KIKI et al.,](#page-134-3) [2020\)](#page-134-3), which has useful features for configuration files, like referencing previous definitions and avoiding the need to repeat entire equal definitions. The main configuration files are:

- *fabric-ca-server-config.yaml -* configurations related to the Fabric [CA](#page-16-10) server.
- fabric-ca-client-config.yaml configurations related to the commands fabric-caclient enroll and fabric-ca-client register.
- configtx.yaml main configuration file. Most of the network topology is defined in this file.
- core.yaml configuration file related to the peers.
- orderer.yaml configuration file related to the orderers.

### 5.1.3.1 fabric-ca-server-config.yaml

In this file, some of the following parameters and characteristics about the Fabric [CA](#page-16-10) server are set:

- Server port;
- Server in debug mode;
- [TLS](#page-17-1) enabled for communication when members are enrolling;
- Certificates and keys for the [CA](#page-16-10) (if they already exist);
- The maximum number that a member can enroll ask for certificate signature;
- Pre-registered identities (usually for [CA](#page-16-10) admins);
- Database parameters;
- Ldap parameters (if enabled);
- Allowed affiliations for registering;
- Signing parameters, expiry times, signing algorithm, etc;
- Idemix parameters;
- Crypto library;
- Intermediate [CAs](#page-16-10); and,
- Operation and metrics server endpoints parameters.

## 5.1.3.2 fabric-ca-client-config.yaml

The command fabric-ca-client enroll will look for this file to perform the enrollment. In this file, parameters related to the organization member enrollment are set:

- [CA](#page-16-10) url;
- [TLS](#page-17-1) files for secure communication;
- CSR (certificate signing request) parameters: common name, signing algorithm, country, state, location, organization unit, and others;
- Configurations related to the registration process;
- Enrollment type; and,
- Crypto library configuration.

# 5.1.3.3 configtx.yaml

This is the main configuration file, as it contains the organizations' information, the default configurations for channel policies, the anchor peers, and orderers. The main parameters defined in this file are:

- Organizations definitions
	- Organization name
	- Organization membership ID
	- Organization [MSP](#page-16-11) type (idemix or x509)
	- Organization policies
	- Organization orderers address
	- Organization anchor peers
- Default access control policies
- Network ordering configuration
	- Ordering tool: kafka or raft
	- Ordering policies
- Default channel configurations
- Profiles
	- System channel definitions
	- Consortiums definitions
	- Specific channels definitions

# 5.1.3.4 core.yaml

Each peer has its core.yaml file from where its configuration is fetched. The main parameters defined in this file are:

- Peer id;
- Listen address and port;
- Gossip protocol configuration for communication among peers;
- Private data configurations;
- Chaincode configurations;
- Database and ledger configurations; and,
- Operation and metrics server endpoints parameters.

### 5.1.3.5 orderer.yaml

Similar to the peer, each orderer has its orderer.yaml file to fetch the configurations. The main orderer parameters are:

- Listen address and port;
- [TLS](#page-17-1) certificates and keys;
- Bootstrap method;
- Crypto library;
- Kafka settings; and,
- Operation, metrics, and administrative server endpoints parameters.

## 5.1.3.6 Overriding configuration files

Hyperledger Fabric peers, orderers, and [CAs](#page-16-10) are developed in Golang, and all configuration files are parsed using the **viper** library [\(FRANCIA,](#page-135-3) [2020\)](#page-135-3). This library loads configuration from [YAML](#page-17-2) files, environment variables, and command flags when calling a command. As an example, consider the orderer configuration field ListenAddress in orderer.yaml presented in Code [5.3.](#page-65-0)

Code 5.3 – Piece of orderer.yaml

<span id="page-65-0"></span>

After parsing the *orderer.yaml* file, viper tries to read environment variables based on the *orderer.yaml* key names. The expected environment variable names' follow the general pattern: **filename**\_**key1**\_**key2-inside-key1**. The ListenAddress could be overridden by setting the environment variable ORDERER GENERAL LISTE-NADDRESS in the orderer docker-compose settings, as shown in Code [5.4.](#page-65-1)

Code 5.4 – Overriding configuration files

<span id="page-65-1"></span>

4 **environment**: 5 - ORDERER\_GENERAL\_LISTENADDRESS=180.180.180.180 6 ...

**Observation**: if a configuration field is formed by a list of attributes, it cannot be overridden by environment variables. The viper priority order for parsing configuration values is:

- 1. Command flags
	- Ex: fabric-ca-client enroll ... **–enrollment.profile idemix**
- 2. Environment variables
- 3. Configuration file values

## **5.1.4 Automated network creation script**

We developed a bash script and some python scripts for creating different networks easily. With these tools, we could deploy a network with as many organizations as necessary. Each organization can have as many admins, clients, orderers, and peers as wished. The script code is available on Github [\(WESTPHALL,](#page-139-3) [2021\)](#page-139-3). In this section, the created scripts are explained.

The first configuration file to be set is presented in Code [5.5.](#page-66-0) In this file, we define a list of organizations in the network, describing their names, the admins, clients, peers, and orderers quantity, followed by the membership service provider type: idemix or x509 certificates.

<span id="page-66-0"></span>

1	organizations:
$\overline{2}$	- name: ufsc
3	admin-quantity: 1
4	$client$ -quantity: $0$
5	peer-quantity: 1
6	orderer-quantity: 1
7	buyer-quantity: 0
8	seller-quantity: 2
9	sensor-quantity: 2
10	msptype: x509
11	
12	- name: parma
13	admin-quantity: 1
14	client-quantity: 0
15	peer-quantity: 1
16	orderer-quantity: 1
17	buyer-quantity: 0
18	seller-quantity: 2
19	sensor-quantity: 2
20	msptype: x509
21	
22	- name: idemixorg

Code 5.5 – Our initial configuration file CONFIG-ME-FIRST.yaml



Then, we call a python script named partialConfigtxGenerator.py to parse the file presented in Code [5.5](#page-66-0) and generate the configtx.yaml file with the organizations' full definitions. The python script also adds all orderers to the raft configurations section in *configtx.yaml*. This leaves only the profiles section or policy changes for manual configuration. Every other field is set according to the organizations described in the file presented in Code [5.5.](#page-66-0)

The next step is to create a single [TLS](#page-17-1) [CA](#page-16-10) for all organizations and one root [CA](#page-16-10) for each organization's [MSP.](#page-16-11) For this, we use the *docker-compose* command to turn on the [CA](#page-16-10) services defined in our *docker-compose.yml* file, with the names ca-tls and rca. Even though only one service named rca is defined in the docker-compose.yml file, Code [5.6](#page-67-0) shows how we create multiple root [CAs](#page-16-10) from a single definition.

The docker-compose command reads environment variables and substitutes them with their value if any variable is referenced in the docker-compose.yml. With this tool, every time we create a root [CA](#page-16-10) for an organization, we simply export the ORG\_NAME environment variable with the organization name.

#### Code 5.6 – Root [CA](#page-16-10) docker-compose.yml

<span id="page-67-0"></span>

There is still one problem: docker does not allow multiple services with the same name in a project. Therefore, docker would only allow the creation of a single service called rca, and it is forbidden to have environment variables references in services names. To get around that, we change the service name before creating a new root [CA](#page-16-10) using perl. Code [5.7](#page-68-0) explicitly shows how we perform this change.

Code 5.7 – Changing service name and starting the service

```
1 perl -pi -e 's/rca:/rca-'$ORG_NAME':/g' docker-compose.yml
2 docker-compose -f docker-compose.yml up -d rca-$ORG_NAME
```
**Observation**: changing the service name will create orphan services, and it will trigger warnings from docker. This is not the best practice for creating multiple services with the same docker image, but it is quick and easy. The proper way to do that would be to generate a docker-compose.yml with all services definitions. Generating a complete docker-compose.yml could be another action performed by the python script partialConfigtxGenerator.py. We apply the same principle to create multiple **peers** and **orderers**.

After the [CAs](#page-16-10) creation, we register and enroll every admin, client, peer, orderer, buyer, seller, and sensor, calling the fabric-ca-client command. The generated [MSP](#page-16-11) credentials are stored in the host machine folders mounted to the virtual docker containers, as shown in lines 11 and 12 of Code [5.6.](#page-67-0) The volume mounting allows the docker containers to use the generated [MSP](#page-16-11) credentials. Figure [12](#page-68-1) shows the structure of an [MSP](#page-16-11) folder on every orderer, peer, or any other enrolled entity.

<span id="page-68-1"></span>

Figure 12 – [MSP](#page-16-11) folder structure

Source: [\(TEAM, F. D.,](#page-138-0) [2020a\)](#page-138-0)

Following all [MSP](#page-16-11) credentials creation, the next step is to make an MSP folder for each organization. The organizational [MSP](#page-16-11) folder must have three folders and one config.yaml file. One folder with organization admin certificates, one folder containing the root [CA](#page-16-10) certificate, and another folder with the [TLS](#page-17-1) [CA](#page-16-10) certificate. The file config.yaml maps the [Organizational Unit \(OU\)](#page-16-12) field in the [MSP](#page-16-11) certificates to admin, client, orderer, or peer roles. In our network case, all sellers, buyers, and sensors are registered as clients.

If the organization uses idemix, the admin certificates folder is substituted by a folder named msp with the idemix issuer public key and revocation public key. Figure [13](#page-69-0) shows the organization [MSP](#page-16-11) folder structure in two different cases. Organizations with x509 [MSP](#page-16-11) have the folder structure presented in the left part of Figure [13.](#page-69-0) The folders on the right are required for an idemix [MSP.](#page-16-11)

<span id="page-69-0"></span>Figure 13 – Organization [MSP](#page-16-11) folder structure - x509 in the left and idemix in the right



Designed by the author

Before the genesis block is generated, our script requires that the system channel, the consortiums, and the application channels are manually declared in the configtx.yaml. Code [5.8](#page-69-1) present a definition for the system channel called "SampleMultiMSPRaft" and a definition for an application channel called "SampleMultiM-SPRaftAppChannel."

It is worth noticing that orderer configurations are only declared in the system channel profile, with the organizations responsible for the network ordering process. Also, the application channel belongs to the consortium "SampleConsortium," which corresponds to the consortium declared in the system channel profile.

<span id="page-69-1"></span>

$\mathbf{1}$	Profiles:
$\overline{2}$	# SampleMultiMSPRaft is a profile to the syschannel.
3	# Remeber to add the organizations and the consortiums
4	SampleMultiMSPRaft:
5	<<: *ChannelDefaults
6	Orderer:
	<<: *OrdererDefaults
8	OrdererType: etcdraft
9	Organizations:
10	$-$ *UFSC
11	$- * PARMA$
12	Consortiums:
13	SampleConsortium:
14	Organizations:
15	$-$ *UFSC
16	$- * PARNA$
17	- *IDEMIXORG
18	
19	# SampleMultiMSPRaftAppChannel is a profile to application channels.
20	# Remeber to add the organizations and the consortium name

Code 5.8 – System channel and application channel definitions



For the genesis block generation, the command configtxgen is called as shown in Code [5.9](#page-70-0) and outputs the genesis block from reading the previously generated and edited configtx.yaml as input. Then, the genesis block is copied to every orderer [MSP](#page-16-11) directory.

Code 5.9 – Generating the genesis block

```
1 configtxgen -configPath $BASE_DIR/generated-config -profile
      SampleMultiMSPRaft -outputBlock
      ${BASE_DIR}/hyperledger/tempgenesis.block -channelID syschannel
```
With genesis block present in every orderer file system, the orderers are started. The path to the genesis block is set in an environment variable, as shown in Code [5.10.](#page-70-1) As they start, the orderers will fetch information about other orderers from the genesis block and communicate with them via the system channel.

Code 5.10 – Setting the path to the genesis block

```
1 orderer:
2 container_name: orderer${ORDERER_NUMBER}-${ORG_NAME}
3 image: hyperledger/fabric-orderer:2.3.0
4 environment:
5 ...
6 - ORDERER_GENERAL_BOOTSTRAPFILE=/tmp/hyperledger/${ORG_NAME}/orderer${ORDERER_NUMBER}/
                 genesis.block
7 ... ...
```
The next step is peer initialization. As soon as each peer is started, they look for other peers' endpoints in the same organization to start communicating. The environment variable CORE PEER GOSSIP BOOTSTRAP defines the list of possible peers to start communicating with on bootstrap. We make every peer communicate to "peer1" of their organization on initialization, as demonstrated in Code [5.11.](#page-70-2)

Code 5.11 – Peer bootstrap configuration

```
1 peer:
2 container_name: peer${PEER_NUMBER}-${ORG_NAME}
3 image: hyperledger/fabric-peer:2.3.0
4 environment:
5 ...
6 - CORE_PEER_GOSSIP_BOOTSTRAP=peer1-${ORG_NAME}:7051
7 ...
```
To configure the peers, we use the Hyperledger Fabric [Command-Line Interface](#page-16-13) [\(CLI\)](#page-16-13) container to interact with peers using administrators' credentials. We instantiate a single [CLI](#page-16-13) container to manage all organizations' entities. All commands executed via [CLI](#page-16-13) could be called from any machine. However, it is easier to utilize the [CLI](#page-16-13) since it is inside the virtual docker network, and commands can reference names of the virtual network [Domain Name System \(DNS\).](#page-16-14)

Code [5.12](#page-71-0) presents an example of a command executed with a [CLI](#page-16-13). Notice how the [CLI](#page-16-13) allows us to reference the name "peer1-ufsc", which is only available inside the virtual docker network. If this same command were called outside the virtual docker network, it would not work since the name "peer1-ufsc" would not be resolved.

Code 5.12 – Cli command example

```
1 docker exec -e CORE_PEER_LOCALMSPID=UFSC -e
      CORE_PEER_ADDRESS=peer1-ufsc:7051 -e
      CORE_PEER_MSPCONFIGPATH=/tmp/hyperledger/ufsc/admin1 /msp -e
      CORE_PEER_TLS_ENABLED=true -e
      CORE_PEER_TLS_ROOTCERT_FILE=/tmp/hyperledger/ufsc/
      admin1/tls-msp/tlscacerts/tls-0-0-0-0-7052.pem cli-ufsc peer lifecycle
      chaincode install energy.tar.gz
```
We create the genesis block for the application channel definition "Sample-MultiMSPRaftAppChannel" presented in Code [5.8](#page-69-1) and use the CLI container to make all peers join the channel. Code [5.13](#page-71-1) demonstrates the command that creates the channel genesis block for the consortium "SampleConsortium."

Code 5.13 – Cli command example

<span id="page-71-1"></span>1 configtxgen -configPath \$BASE\_DIR/generated-config -profile SampleMultiMSPRaftAppChannel -outputCreateChannelTx \${BASE\_DIR}/hyperledger/\$firstOrgInChannelLower/ admin1/\$channelID.tx -channelID \$channelID --asOrg \$orgName

The application channel requires a definition for organizations' **anchor** peers to allow peers from different organizations to gossip. We set the organization's first peer as an anchor by altering the application channel configuration. A single anchor peer per organization is enough to enable all organization's peers to be discovered from outside of it. This definition is also required to enable that applications perform Service Discovery on the channel to know the endorsing peers for a transaction, explained in Section [5.3.5.](#page-95-0)

After all the peers are in the channel, we install our developed smart contract called "**energy**," presented in section [5.2.](#page-72-0) The contract installation goes through
the steps of packing, installing, approving, and committing. Code [5.14](#page-72-0) presents the commands related to the steps to install the contract. We omit the command flags and environment variables settings, but they are available in our Github [\(WESTPHALL,](#page-139-0) [2021\)](#page-139-0).

#### Code 5.14 – Cli command example

- <span id="page-72-0"></span>1 cli-\$orgNameLower peer lifecycle chaincode package #each organization admin package each chaincode once
- 2 cli-\$orgNameLower peer lifecycle chaincode install #each organization admin install the chaincode in every peer of their organization
- 3 cli-\$orgNameLower peer lifecycle chaincode approveformyorg #each organization admin approves each chaincode definition once
- 4 cli-\$committerOrgLower peer lifecycle chaincode commit #only one admin on the channel needs to commit the chaincode, after most organizations approved the chaincode definition

Finally, some chaincodes might require the admin to call the initialization function before they are available for normal use. Depending on the chaincode, calling the initialization function is the last required step to have it all ready for use. The "**energy**" smart contract, as an example, requires initialization.

The applications that transact with the "**energy**" smart contract are executed in an ubuntu container, called *cli-applications*, within the same network as peers and orderers. Deploying applications in this container avoids problems with endpoints' names ([DNS](#page-16-0)) and ports found by the discovery service, which is a tool that can increase transaction throughput.

## 5.1.4.1 Network created

Figure [14](#page-73-0) shows the resulting docker private network after executing our local deploy script. The first two containers are the chaincodes for the two peers. The ca-tls generates x509 certificates to support [TLS](#page-17-0) communication, while each organizations' rcas provide the membership x509 certificates.

The parma and ufsc organizations have each one peer and one orderer. The [CLI](#page-16-1) container helps the deployment process for chaincode installation, and cli-application-1 executes applications that interact with the blockchain.

## 5.2 CHAINCODE DEPLOYMENT

In this section, we present the developed chaincode that executes in every peer of the network. It contains functions to execute the actions displayed by the sequence diagram in Figures [10](#page-57-0) and [11.](#page-58-0)

<span id="page-73-0"></span>

#### Figure 14 – Resulting network in docker



Go was the chosen language to implement our model since this is a general recommendation for developers because it matches the Hyperledger Fabric implementation language. Usually, the new chaincode features become available first in Go, besides generating smaller docker images. Also, the authors of [\(FOSCHINI et al.,](#page-135-0) [2020\)](#page-135-0) analyzed each chaincode language - Go, Java and Javascript - and identified a better performance on contracts written in Go.

#### **5.2.1 World State keys and values**

Hyperledger Fabric transactions interact with the ledger and World State, usually reading or writing to a State. Fabric's State database stores key-value pairs representing different states, with the key as a string and the value stored as bytes. In our chaincode, we store Go structs after serializing them to [Protocol Buffers \(protobuf\)](#page-16-2).

A key can be **simple** with a single name identification with only utf-8 characters. Another possibility is the **composite** one, when the goal is to form the key with an *object type* and many attributes. The *object type* and the attributes are placed in sequence and separated by the minimum Unicode character (\u0000), aiming to avoid collisions with **simple** keys.

Hyperledger Fabric enables fetching State values by providing the full key or a key prefix. Code [5.15](#page-74-0) exhibits the GetState functions and their appropriate context. Deletions and insertions are also possible by providing the full State key.

Code 5.15 – ActiveSensor struct

```
1 //get state by its full key
2 GetState(key string) ([]byte, error)
3
4 //get SIMPLE key states within the range [startKey, endKey[ - alphabetic
      order
5 GetStateByRange(startKey, endKey string) (StateQueryIteratorInterface,
      error)
6
7 //get COMPOSITE key states formed by:
      objectType|U+0000|attr1|u+0000|attr2...
8 GetStateByPartialCompositeKey(objectType string, keys []string)
      (StateQueryIteratorInterface, error)
```
#### **5.2.2 Choosing the most appropriate database**

Hyperledger Fabric supports two databases to store the ledger and World State. Go LevelDB has a simple key-value architecture and only supports key, key range, and composite key queries [\(TEAM, F. D.,](#page-139-1) [2020b\)](#page-139-1). On the other hand, CouchDB supports more diverse queries, as long as the data is modeled in [JSON](#page-16-3) format. After some tests presented and discussed in Section [7.1,](#page-110-0) we opted for **LevelDB** due to significantly better performance results.

## <span id="page-74-1"></span>**5.2.3 Identifying chaincode function callers**

Fabric-chaincode-go provides a Client Identity Chaincode Library to read certificate attributes and ensure attribute-based access control [\(TEAM, F.,](#page-138-0) [2021\)](#page-138-0). Code

[5.16](#page-75-0) exemplifies how to restrict access to a chaincode function by testing the value of an attribute on the caller x509 certificate.

<span id="page-75-0"></span>Code 5.16 – Ensuring that only callers with the attribute "energy.seller" execute a function execution

```
1 ...
2 //only sellers can execute this function
3 err := cid.AssertAttributeValue(stub, "energy.seller", "true")
4 if err != nil {
5 return shim.Error(err.Error())
6 }
7 ...
```
Every network participant can be uniquely identified by the concatenation of their MspID and CertificateID. The MspID is equivalent to the participant's organization name, and the CertificateID, unique within the same organization, derives from the x509 certificate Distinguished Names (DN) as displayed in Code [5.17.](#page-75-1) We resort to this identification technique in many of our chaincode structs, described in Section [5.2.4.](#page-75-2)

<span id="page-75-1"></span>Code 5.17 – How IDs are generated from the x509 certificate (from https://github.com/hyperledger/fabric-chaincode-go/)

```
1 func (c *ClientID) GetID() (string, error) {
2 ...
3 // The leading "x509::" distinguishes this as an X509 certificate, and
4 // the subject and issuer DNs uniquely identify the X509 certificate.
5 // The resulting ID will remain the same if the certificate is renewed.
6 id := fmt.Sprintf("x509::%s::%s", getDN(\&c.cert.Subject),
         getDN(&c.cert.Issuer))
7 return base64.StdEncoding.EncodeToString([]byte(id)), nil
8 }
```
## <span id="page-75-2"></span>**5.2.4 Main data structs**

To provide a general view of our chaincode, in the following subsections, we explain the main structs defined in it. The struct name is always used as a prefix to the World State key, together with other fields. Almost all fields containing "ID" in the name refer to the identification ways presented in Section [5.2.3.](#page-74-1)

#### 5.2.4.1 ActiveSensor struct

The ActiveSensor struct, displayed in Code [5.18,](#page-76-0) gathers the sensor's MspID, SensorID, and the indication if the sensor is active or not. In our implementation, we assume that the sensors are stationary. Therefore, they have the fixed coordinates  $X$ , Y, Z. The Radius represents the maximum distance from the coordinates with similar environmental characteristics as measured by the sensor. The coordinates and the radius are fetched from the sensor's x509 certificate attributes.

This struct has two main purposes, with the first being to enable or disable the sensor by changing the IsActive value. The other purpose involves identifying the sensors near a seller and fetching these sensors' SmartData to validate an energy generation claim. The ActiveSensor World State key is in line [1](#page-76-1) of Code [5.18.](#page-76-0)

```
Code 5.18 – ActiveSensor struct
```

```
1 //key in the World State = stub.CreateCompositeKey("ActiveSensor",
     []string{MspID, SensorID}
2 type ActiveSensor struct {
3 MspID string 'protobuf:"..." json:"..."'
4 SensorID string 'protobuf:"..." json:"..."'
5 IsActive bool 'protobuf:"..." json:"..."'
6 X int32 'protobuf:"..." json:"..."'
7 Y int32 'protobuf:"..." json:"..."'
8 Z int32 'protobuf:"..." json:"..."'
9 Radius float64 'protobuf:"..." json:"..."'
10 }
```
## 5.2.4.2 SmartData struct

Every time a sensor publishes an observed metric to the ledger, the chaincode stores the corresponding SmartData. Each SmartData field is explained in Section [2.4,](#page-34-0) but the AssetID, which is composed of the smart meter's MspID and the SensorID from the x509 certificate. This struct plays an essential role in the energy validation process when the chaincode fetches near sensors' SmartData to evaluate the energy generation claim trustworthiness.

The coordinates fields are not in this struct because they are already set in ActiveSensor. Considering that the coordinates are always fetched from the x509 certificate, duplicating the coordinates in the *SmartData* struct only increases memory usage unnecessarily. If our chaincode accepted data from moving sensors, this struct would require redesign.

Its World State key is presented by Code [5.19](#page-77-0) in lines [1](#page-77-1) and [2.](#page-77-2) Different from the ActiveSensor struct, the SmartData key is not a composite key but a simple one. This design choice enables efficient queries when requesting a set of Smart-Data from a specific sensor within a timestamp range. The Hyperledger chaincode function shim.ChaincodeStubInterface.GetStateByRange(startKey, endKey string) executes these queries efficiently, but it works only with simple keys. We discuss these SmartData queries' performance further in Section [7.1.1.1.](#page-111-0)

Code 5.19 – SmartData struct

```
1 //AssetID = SensorMspID + SensorID
2 //key in the World State = "SmartData" + AssetID +
     getMaxUint64CharsStrTimestamp(Timestamp)
3 type SmartData struct {
4 AssetID string 'protobuf:"..." json:"..."'
5 Version int32 'protobuf:"..." json:"..."'
6 Unit uint32 'protobuf:"..." json:"..."'
7 Timestamp uint64 'protobuf:"..." json:"..."'
8 Value float64 'protobuf:"..." json:"..."'
9 Error uint32 'protobuf:"..." json:"..."'
10 Confidence uint32 'protobuf:"..." json:"..."'
11 Dev uint32 'protobuf:"..." json:"..."'
12 }
```
Since the GetStateByRange() checks if a key is within the desired range based on the alphabetical order, the function getMaxUint64CharsStrTimestamp, shown in Code [5.20,](#page-77-3) forces every timestamp string representation to have the same length. For example, two SmartData from a sensor, one published in timestamp 2 and the other in timestamp 10, without a correction, would have the keys, respectively, AssetID|2 and AssetID|10.

In this context, if the chaincode tried to retrieve the SmartDatas with timestamp between 1 and 15, the SmartData of key AssetID|2 would not be fetched because, considering the alphabetic order, the string AssetID|2 is greater than AssetID|15. To avoid this failure type, the function getMaxUint64CharsStrTimestamp generates an equivalent timestamp string representation as lengthy as the greatest uint64 by adding zeros in the beginning to fill the difference.

Code 5.20 – getMaxUint64CharsStrTimestamp function

```
1 func getMaxUint64CharsStrTimestamp(timestamp uint64) string {
2 timestampStr := strconv.FormatUint(timestamp, 10)
3 for i := len(timestampStr); i < maxUint64Chars; i++ {
4 timestampStr = "0" + timestampStr
5 }
6 return timestampStr
```
### 5.2.4.3 SellerInfo struct

When the chaincode receives a seller registration request, it stores their related information with the struct SellerInfo, with the seller's and their smart meter's certificate identification. This struct also contains the owned wind turbines and solar panels quantity so that the chaincode might have parameters to calculate the maximum possible energy generation amount.

After validating the energy generated, the chaincode increments the map EnergyToSellByType, which stores the seller's salable energy quantity, in [kWh,](#page-16-4) per type - solar, wind, or other. The seller can only request energy validation for a certain time interval [start time, end time[ if the start time is greater than the LastGenerationTimestamp value. Otherwise, the chaincode will deny the request.

When the seller desires to liquidate the validated energy, they publish a SellBid, described in Section [5.2.4.5,](#page-79-0) partly identified by the value of LastBidID added to one. Subsequently, the fields LastBidID and the EnergyToSellByType are updated in the SellerInfo struct.

**Observation**: WindTurbinesNumber and SolarPanelsNumber merely represent the needed information to achieve a reasonable maximum energy generation estimation. More information could be required in a real application, but this specificity is out of our scope.



#### Code 5.21 – SellerInfo struct

 $\overline{7}$ 

#### 5.2.4.4 MeterSeller struct

The MeterSeller struct, displayed in Code [5.22,](#page-79-1) serves as a pointer for the chaincode to find a SellerInfo by the smart meter credentials. Figure [15](#page-79-2) elucidates two possible queries to retrieve a SellerInfo, one by directly informing the key and the other by using the MeterSeller struct as a pointer.

We created this auxiliary struct after our preliminary metrics findings described in Section [7.1](#page-110-0) when we concluded that LevelDB performs outstandingly faster than CouchDB. However, LevelDB has the downside of only supporting full or partial key state queries, whereas CouchDB allows more specific [JSON](#page-16-3) ones. Opting for CouchDB would imply in the MeterSeller struct unnecessity, at a performance cost.

Code 5.22 – MeterSeller struct

```
1 //key in the World State = stub.CreateCompositeKey(objectType,
     []string{mspIDSmartMeter, smartMeterID})
2 type MeterSeller struct {
3 MspIDSeller string 'protobuf:"..." json:"..."'
4 SellerID string 'protobuf:"..." json:"..."'
5 }
```
Figure 15 – Possible ways to fetch a SellerInfo from World State

<span id="page-79-2"></span>

<span id="page-79-0"></span>Designed by the author

#### 5.2.4.5 SellBid struct

Once a seller's energy is validated, they can offer it to buyers by publishing a SellBid to the chaincode. This struct saves the seller's identification, the sequential sell bid number, the energy quantity in [kWh](#page-16-4) to be sold, the price per [kWh,](#page-16-4) and the energy type - wind, solar or other. The chaincode collects all SellBids in the World State to execute the auction from time to time.

After the auction, all satisfied SellBids are deleted from the World State to avoid complexities when retrieving SellBids for the following auctions. Still, the Ener-gyTransaction struct, explained in Section [5.2.4.7,](#page-81-0) stores the satisfied SellBids fields.

Code 5.23 – SellBid struct

```
1 //SellBid aprox. memory size = 10 + 177 + 4 + 8 + 8 + 10 = 217 bytes
2 //key in the World State = stub.CreateCompositeKey("SellBid",
      []string{MspIDSeller, SellerID, SellerBidNumber})
3 type SellBid struct {
4 MspIDSeller string 'protobuf:"..." json:"..."'
5 SellerID string 'protobuf:"..." json:"..."'
6 SellerBidNumber uint64 'protobuf:"..." json:"..."'
7 EnergyQuantityKWH float64 'protobuf:"..." json:"..."'
8 PricePerKWH float64 'protobuf:"..." json:"..."'
9 EnergyType string 'protobuf:"..." json:"..."'
10 }
```
#### 5.2.4.6 BuyBid struct

Unlike the SellBid, the BuyBid does not contain any buyer information because it is published by a buyer with idemix credentials, ensuring pseudonymity. The fields MspIDPaymentCompany, which is the payment company organizational name, and the payment Token uniquely identify the BuyBid. To avoid possible attacks on different utility companies, the field UtilityMspID specifies the buyer's utility company. Otherwise, they could maliciously lend their credentials to a client of a different utility company, enabling two bill discounts for the same BuyBid.

EnergyQuantityKWH, PricePerKWH, and EnergyType have the same function as in the SellBid. Every BuyBid needs to be validated by the payment company before it can participate in an auction, confirming to the seller that they will get paid in case of matching a BuyBid. Code [5.24](#page-81-1) lines [1](#page-81-2) and [2](#page-81-3) present the two possible keys for a BuyBid struct.

We also identify the validity in the key, true for validated and false otherwise. This design pattern allows efficient validated BuyBids fetching by the partial key "BuyBid|U+0000|true", increasing the auction speed. The satisfied BuyBids are also

<span id="page-81-1"></span>deleted from the World State after the auction.

```
Code 5.24 – BuyBid struct
```

```
1 //keys in the World State = stub.CreateCompositeKey("BuyBid",
      []string{"false", mspIDPaymentCompany, token})
2 // or = stub.CreateCompositeKey("BuyBid", []string{"true",
      mspIDPaymentCompany, token})
3 type BuyBid struct {
4 MspIDPaymentCompany string 'protobuf:"..." json:"..."'
5 Token string 'protobuf:"..." json:"..."'
6 UtilityMspID string 'protobuf:"..." json:"..."'
7 EnergyQuantityKWH float64 'protobuf:"..." json:"..."'
8 PricePerKWH float64 'protobuf:"..." json:"..."'
9 EnergyType string 'protobuf:"..." json:"..."'
10 }
```
## <span id="page-81-0"></span>5.2.4.7 EnergyTransaction struct

The EnergyTransaction struct, presented in Code [5.25,](#page-81-4) results from matching a BuyBid and a SellBid, created during the auction process. It joins the main fields of the two structs, enabling that the seller requests their payment and that the buyer asks for a bill discount. EnergyQuantityKWH and PricePerKWH probably differ from the bids because the auction might only partially satisfy a bid or need multiple SellBids to satisfy a single BuyBid. To uniquely identify an EnergyTransaction, we form the key as displayed in line [1](#page-81-5) of Code [5.25.](#page-81-4)

```
Code 5.25 – EnergyTransaction struct
```
<span id="page-81-5"></span><span id="page-81-4"></span>

Figure [16](#page-82-0) illustrates how our chaincode executes the auction process, plus presents the conditions when transacting energy in an alternative energy market is ideal. If the prices are better than with the main grid, people transact in the alternative market. The chaincode sorts the BuyBids in price-descending order and the SellBids in the ascending. The bids are sequentially matched while the BuyBid price exceeds the SellBid price. When this condition changes, the matching stops, and the Clearing Price is calculated from the average price of the last matched BuyBid and SellBid. Everyone receives or pays this specific price for the energy transacted, maximizing the participants' welfare.

<span id="page-82-0"></span>

Figure 16 – Double auction in an alternative energy market

Source: [\(ALABDULLATIF et al.,](#page-133-0) [2020\)](#page-133-0)

### **5.2.5 Energy validation**

As soon as a seller invokes the publishEnergyGeneration chaincode function, the network tries to validate the claim against the SmartData published by sensors. We implemented two **representative** functions to check the validity of wind and solar energy generation claims.

The chaincode considers the seller's location and lists all the near sensors trusted by validators. After that, it fetches the sensors' published SmartData within the generation claim interval. As an example, if the seller declares that the energy was generated between 1:00 PM to 2:00 PM, only SmartData within this period will be retrieved from the World State.

After receiving a solar energy generation claim, the chaincode calls getMax-PossibleGeneratedSolarEnergyInInterval, displayed in Code [A.1.](#page-141-0) This function loops through the SmartData list and selects only the ones with Candela (luminosity) unit. First, the function calculates each sensor SmartData average, **assuming they were published with constant frequency**. Then, it uses these averages to calculate the average of all sensors. Finally, the maximum possible energy generation is returned based on this last average and the sellers' solar panels quantity.

It is important to reinforce that this function **was not designed** to accurately calculate the maximum energy amount on a real deploy environment, which would require more expertise. However, the function applies a database load equivalent to a real application when fetching SmartData, satisfying our experiment needs.

#### **5.2.6 Auction chaincode events**

Chaincode functions can trigger events to applications after the transaction with the function call is published in a block. Regardless of the transaction being ruled valid or invalid, the event is sent to applications that subscribed to it. This tool avoids that applications constantly poll the chaincode to find out about state changes.

Our developed chaincode generates an event when an auction transaction is published to the channel block. Then, buyers and sellers can query the channel to verify if their bids were matched, resulting in an EnergyTransaction. We show eventing examples in Section [5.3.3.2.](#page-91-0)

# **5.2.7 Avoiding transaction invalidation due to changes in Read/Write key set (Phantom reads)**

In the Hyperledger Fabric **execute-order-validate** transaction flow, delivering the transaction to the orderer guarantees that it will be published in a block. However, it does not imply anything on its validity. A modification on a read value by another transaction might cause invalidation, depending on how they are ordered. In our chaincode, this could happen if a BuyBid is validated or a new SellBid is published before the auction transaction is committed. Even though no bids were modified but only added, the auction can be invalidated due to a phantom read.

A phantom read happens when a transaction queries states using the function GetStateByRange(startKey, endKey) and the query result in the simulation phase is different than in the validation phase [\(TEAM, F. D.,](#page-139-2) [2020c\)](#page-139-2). Figure [17](#page-84-0) illustrates the problem in our chaincode context. The auction reads all Buy and Sell bids present in the World State of **Block m** during the simulation phase. Then, the auction transaction is ordered in the **Block m+1**, just after a sell bid registration transaction that created Sell Bid N+1.

At validation time, the peers notice that the auction read all sell bids, but the Sell Bid N+1 was not read. By default, peers will invalidate the auction transaction, assuming that missing the new Sell Bid  $N+1$  could cause an error. However, this does not lead to an error in our application, as the new sell bid would be processed in the next auction.

Initially, we thought adding a priority to the auction transaction - to force the orderer to place it as the first transaction of a block - would solve the problem. After modifying fabric's source code to let different transactions having distinct priorities, we realized it only solved phantom reads in **sequential** blocks. Figure [18](#page-85-0) shows how our first solution fails when phantom read conflicts happen in a non-sequential block context.

<span id="page-84-0"></span>

Figure 17 – Phantom read conflict in sequential blocks

Designed by author

The auction simulation takes more time than a sell bid registry transaction, possibly causing the auction simulated with **Block m's** World State to be ordered in **Block m+2**. By principle, blockchains do not allow modifications on previous blocks, so, to permanently avoid phantom read conflicts, we enabled chaincode functions to define if this type of check should be executed at validation time.

We chose to keep the first solution modifications, regarding transaction pri-

orities, in our patched Hyperledger Fabric because, although we did not need it, blockchain researchers discuss solutions related to transaction ordering methods to avoid invalidations, like the authors of [\(GOEL et al.,](#page-135-1) [2018\)](#page-135-1) and [\(XU et al.,](#page-140-0) [2021\)](#page-140-0). As presented in Code [5.26,](#page-85-1) our solution lets the more costly transaction functions publishEnergyGeneration and auction to bypass the phantom read check and not be invalidated by other recurring functions that alter or add SellBids, BuyBids, ActiveSensors, and SmartData.

With our modification, at validation time, the peers will check the transaction response. If it returned with the function SuccessWithPriorityBypassPhantomRead-Check, they will not perform the phantom read check and validate the transaction. The full modification patch is available in our Github [\(WESTPHALL,](#page-139-0) [2021\)](#page-139-0).

<span id="page-85-0"></span>

Figure 18 – Phantom read conflict in non-sequential blocks

**Time** 

Designed by author

<span id="page-85-1"></span>Code 5.26 – Enabling chaincode function return setting a priority, preventing the transaction invalidation due to the reads on lines [3,](#page-86-0) [10](#page-86-1) and [12](#page-86-2)

1 func (chaincode \*EnergyChaincode) publishEnergyGeneration(stub shim.ChaincodeStubInterface, t0 uint64, t1 uint64,

```
energyByTypeGeneratedKWH map[string]float64) pb.Response {
2
 3 stub.GetStateByPartialCompositeKey("ActiveSensor", []string{}) //called
      indirectly by getActiveSensorsList()
4 ...
 5 return shim.SuccessWithPriorityBypassPhantomReadCheck(
 6 []byte(successMessage), pb.Priority_MEDIUM)
 7
8 }
9 func (chaincode *EnergyChaincode) auction(stub shim.ChaincodeStubInterface)
      pb.Response {
10 stub.GetStateByPartialCompositeKey("SellBid", []string{})
11 ...
12 stub.GetStateByPartialCompositeKey("BuyBid", []string{"true"})
13 ...
14 return shim.SuccessWithPriorityBypassPhantomReadCheck(nil,
15 pb.Priority_HIGH)
16 }
```
## <span id="page-86-2"></span><span id="page-86-1"></span>5.3 APPLICATION DEPLOYMENT

After the network is deployed, applications can interact with it through chaincodes. The peer commands are a tool to transact in the network, but calling terminal commands and storing their return from applications developed in a general-purpose programming language is impractical. For that reason, Hyperledger Fabric provides [SDKs.](#page-16-5)

This Section describes how Fabric's Java [SDK](#page-16-6) and Java Gateway served as tools to build applications related to our chaincode. Some modifications on the [SDK](#page-16-6) and Gateway were required to satisfy our model and experiment needs. We implemented one application for each stakeholder in our network: buyer, seller, sensor, utility company, and payment company.

# **5.3.1 Fabric [SDKs](#page-16-5)**

Hyperledger Fabric documentation defines the [SDKs](#page-16-5) as "a layer of abstraction on top of the wire-level protobuf based communication protocol used by client applications to interact with a Hyperledger Fabric blockchain network" [\(TEAM, F.,](#page-138-1) [2020b\)](#page-138-1). Until Fabric version 2.3, there were Fabric [SDKs](#page-16-5) in four programming languages: Java, Javascript, Go, and Python. All actions and commands performed in Section [5.1](#page-60-0) could have been done with [SDK](#page-16-6) functions, as they possess similar resources.

[SDKs](#page-16-5) have some differences from one another. As an example, the Python [SDK](#page-16-6)

supports mainly 1.4.x Fabric versions, while the others support the 1.4.x and 2.x.x. The Java [SDK](#page-16-6) is the only one with Idemix support. In our case, since we deal with Idemix [MSP,](#page-16-7) we write our applications using the Java [SDK.](#page-16-6) More specifically, we work with the Fabric Java Gateway.

The fabric-sdk-java had to be adapted to allow our required needs when dealing with idemix credentials. The modifications, highlighted in red, presented in Codes [5.27](#page-87-0) and [5.28](#page-87-1) enabled calling serializing methods outside the *fabric-sdk-java* package. After signing a transaction, we desired to store the used idemix pseudonym to later transaction authorship prooving. Codes [5.29](#page-87-2) and [5.30](#page-87-3) display the necessary changes to achieve that. The whole *fabric-sdk-java* was recompiled and used as a dependency to recompile the fabric-gateway-java.

<span id="page-87-0"></span>Code 5.27 – Allowing outside package access to the serialization method of Idemix-Credential class

1 public Idemix.Credential toProto();

<span id="page-87-1"></span>Code 5.28 – Allowing outside package access to the serialization method of textitIdemixIssuerPublicKey class

1 public Idemix.IssuerPublicKey toProto();

<span id="page-87-2"></span>Code 5.29 – Adding a method to retrieve the SigningIdentity from the Transaction-Context class

```
1 public SigningIdentity getSigningIdentity() {
2 return signingIdentity;
```
3 }

<span id="page-87-3"></span>Code 5.30 – Allowing outside package access to the random part of the Idemix-Pseudonym class

```
1 public BIG getRandNym() {
2 return RandNym;
3 }
```
## **5.3.2 Fabric gateways**

Fabric gateways provide minimal necessary functions to applications submit transactions and query ledger contents [\(TEAM, F.,](#page-138-2) [2020a\)](#page-138-2). It is built from a subset of Fabric [SDKs](#page-16-5) methods. Figure [19](#page-88-0) present the relation between [SDKs](#page-16-5) and gateways.

We chose fabric-gateway-java as the tool to interact with our Fabric network. Fabric-gateway-java currently supports only identities with x509 certificates, even

<span id="page-88-0"></span>

## Figure 19 – [SDK](#page-16-6) vs. Gateway comparison

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though the fabric-sdk-java supports x509 and Idemix. Since we intended to test our model's privacy solutions, we followed the x509 identity example and implemented the required Identity interfaces to provide Idemix support.

We implemented the classes IdemixIdentity, IdemixIdentityImpl, and Idemix-IdentityProvider to support Idemix [\(WESTPHALL,](#page-139-0) [2021\)](#page-139-0). We also modified the Identities, GatewayImpl, and WalletImpl classes. Codes [5.31,](#page-88-1) [5.32,](#page-89-0) and [5.33](#page-89-1) present the signature of the added/modified methods highlighted in **red**.

Code 5.31 – Added methods to the gateway class Identities

```
1 public static IdemixIdentity newIdemixIdentity(final String mspId, Path
       ipkPath, Path revocationPkpath,
 2 Path signerConfigPath);
 3
 4 public static IdemixIdentity newIdemixIdentity(final String mspId, final
       IdemixEnrollment enrollment);
 5
 6 public static IdemixIdentity newIdemixIdentity(final String mspId, final
       IdemixIssuerPublicKey idemixIpk, final PublicKey revocationPublicKey,
       final JsonObject signerConfigJson) );
 7
8 public static PublicKey readPublicKey(final String pem);
9
10 public static PublicKey readPublicKey(final Reader pemReader);
11
12 private static SubjectPublicKeyInfo asSubjectPublicKeyInfo(final Object
```
pemObject);

14 public static String toPemString(final PublicKey publicKey);

```
Code 5.32 – Modifications on methods in the GatewayImpl class
```

```
1 @Override
2 public Builder identity(final Identity identity) {
 3 if (null == identity) {
4 throw new IllegalArgumentException("Identity must not be null");
 5 }
 6 if (!(identity instanceof X509Identity || identity instanceof
          IdemixIdentity)) {
 7 throw new IllegalArgumentException("No provider for identity type:
             " + identity.getClass().getName());
8 }
9 this.identity = identity;
10 return this;
11 }
12
13 private HFClient createClient() {
14 HFClient client = HFClient.createNewInstance();
15 // Hard-coded type for now but needs to get appropriate provider from
         wallet (or registry)
16 if (identity instanceof X509Identity)
17 X509IdentityProvider.INSTANCE.setUserContext(
18 client, identity, "gateway");
19 else if (identity instanceof IdemixIdentity)
20 IdemixIdentityProvider.INSTANCE.setUserContext(
21 client, identity, "gateway");
22 return client;
23 }
```
Code 5.33 – Modifications on map declaration in the WalletImpl class

```
1 public final class WalletImpl implements Wallet {
2 private final WalletStore store;
3 private final Map<String, IdentityProvider<?>> providers = Stream
4 .of(new IdentityProvider<?>[]
5 {X509IdentityProvider.INSTANCE,
6 IdemixIdentityProvider.INSTANCE})
7 .collect(Collectors.toMap(IdentityProvider::
8 getTypeId, provider -> provider));
```
9 }

Furthermore, we enabled access to the TransactionContext instance of a transaction, as presented in Codes [5.34](#page-90-0) and [5.35.](#page-90-1) After our fabric-sdk-java modifications, the transaction context has a public method to retrieve the SiginingIdentity of any message. With that, a buyer application can store the IdemixPseudonym to prove the credentials ownership to a utility company by signing a message with the same IdemixPseudonym as the BuyBid transaction.

<span id="page-90-0"></span>Code 5.34 – Adding the getTransactionContext() method declaration to the fabricgateway-java class Transaction class

```
1 TransactionContext getTransactionContext();
```
<span id="page-90-1"></span>Code 5.35 – Adding the getTransactionContext() method implementation to the fabricgateway-java class TransactionImpl class

```
1 @Override
2 public TransactionContext getTransactionContext() {
3 return transactionContext;
\overline{4}
```
#### <span id="page-90-2"></span>**5.3.3 Applications implementation**

The applications were implemented with our modified fabric-gateway-java version, even though only the buyer's and utility's applications had this unavoidable requirement due to idemix utilization. The other entities' applications could have been implemented in any other fabric-sdk supported language.

Before transacting with the network, we provide three ways to load the certificates or idemix credentials. They can be fetched by **enrolling** with the [MSP'](#page-16-7)s [CA,](#page-16-8) loading from the **file system**, or loading from a fabric-gateway-java **wallet**. The only difference between the file system and wallet loading is the storage format. The first loads the x509 certificate and the private key directly, while the other loads a [JSON](#page-16-3) formatted file containing both the certificate and private key.

Peers, orderers, and [CAs](#page-16-8) are defined in a configuration file describing their addresses and some network characteristics. Because our network secures communication with [TLS,](#page-17-0) the configuration file also has the path to the entities' [TLS](#page-17-0) [CAs](#page-16-8) certificate. We did not enable the [TLS](#page-17-0) mutual authentication. Therefore the applications are not authenticated to the orderers and peers.

#### 5.3.3.1 Sensor's application

A sensor with a valid [MSP](#page-16-7) certificate reads an environment metric, and the data is stored in the blockchain after a call to the chaincode function publishSmartData. The coordinates considered by the chaincode are present in the sensor's certificate attributes. Depending on the sensor's processing constraints, the blockchain interaction and the certificate management would probably be performed by a gateway device. Code [5.36](#page-91-1) exhibits the described sensor's action and, since it is a testing source, we deal with random smart data instead of a real measure.

Code 5.36 – How sensors publish SmartData to the blockchain

```
1 SmartData smartData = getRandomSmartData(unit, threadNum, publish);
2 Transactiontransaction = contract.createTransaction("publishSensorData");
3 byte[] transactionResult =
      transaction.submit(Byte.toString(smartData.version),
4 Long.toString(smartData.unit), Long.toString(smartData.timestamp),
5 Double.toString(smartData.value), Byte.toString(smartData.error),
6 Byte.toString(smartData.confidence), Integer.toString(smartData.dev));
```
## <span id="page-91-0"></span>5.3.3.2 Buyer's application

As displayed in Code [5.37,](#page-91-2) before the buyer can publish *BuyBids* to the network, they need to put funds in their payment account and request a token from their payment company. We establish a representative [Hypertext Transfer Protocol \(HTTP\)](#page-16-9) connection between the buyer and the payment company, even though a real deployment would require secure communication. After the registerBuyBid call carrying the BuyBid information, the buyer requests that the payment company validates it.

When the auction occurs, and the BuyBid is effectively matched to a SellBid, the buyer requests a nonce to their utility company. Then, they sign the transaction ID concatenated to the nonce and add the bid information to a list. The energy bill discount request is performed by the auction event listener presented in Code [5.38,](#page-92-0) which communicates with the utility through [HTTP.](#page-16-9)

Code 5.37 – Buyer's application main function calls

```
1 putFundsOnPaymentAccount(1000);
\mathfrak{D}3 String token = requestPaymentToken();
\Delta5 Transaction transaction = contract.createTransaction("registerBuyBid");
6 byte[] transactionResult =
      transaction.submit(cmd.getOptionValue("paymentcompanyid"), token, "UFSC",
```


Code 5.38 – Piece of auction event listener code

```
1 Consumer<ContractEvent> auctionPerfomedListener = new
      Consumer<ContractEvent>() {
 2 @Override
 3 public void accept(ContractEvent t) {
 4 if (t.getName().equals("auctionPerformed")) {
 5 int utilityNonce = getUtilityCompanyNonce();
 6 ...
 7 requestEnergyDiscount(buyerFullName,
                 publishedBid.transactionID, publishedBid.ipk,
                ipkOwnershipSignatureProof);
8 ... ... ... ...
9 }
10 }
11 };
12 contract.addContractListener(auctionPerfomedListener, "auctionPerformed");
```
## 5.3.3.2.1 Random generation configuration

By Hyperledger design, each new transaction signed with idemix requires a new pseudonym. The pseudonym creation uses java SecureRandom and, in Linux, the secure random default algorithm is NativePRNG. In this method, seeds are fetched from /dev/random, consuming much time in an operating system lacking entropy sources. In a test context, buyer applications simulating multiple buyers will recurrently block and wait for the /dev/random to print entropy.

To surpass this restriction, in our tests, we execute the buyer applications with the flag in red displayed in Code [5.3.3.2.1.](#page-92-1) This forces SecureRandom to use a [Deterministic Random Bit Generator \(DRBG\)](#page-16-10) algorithm, which does not block for that long, with default configuration displayed in Code [5.39.](#page-93-0)

<span id="page-92-1"></span>1 mvn exec:java@buyer-test -Dexec.mainClass="applications.AppBuyerForTest"

2 -Djava.security.egd=file:/dev/./urandom

Code 5.39 – java.security default configuration for [DRBG](#page-16-10) algorithms

```
1 # The default value is an empty string, which is equivalent to
2 # securerandom.drbg.config=Hash_DRBG,SHA-256,128,none
```
## 5.3.3.3 Seller's application

The seller's application, in Code [5.40,](#page-93-1) follows the same principles of the buyer one, but with a few extra function calls. For testing purposes, we configured the seller's application to publish energy generation transactions and then create a sell bid for the generated energy. However, in a real deployed network, the role of publishing energy generation claims could be performed by a gateway connected to the seller's smart meter.

Like the buyer's application, there is also an auction event listener in this one, as demonstrated by line [1](#page-93-2) of Code [5.40.](#page-93-1) The only difference being that in this case, the event handler deals with requesting funds for the payment company due to the energy sold.

Code 5.40 – Seller's application main function calls

```
1 registerAuctionEventListener(contract, (X509Identity) identity,
      publishedBids, sellerFullName);
2 \ldots3 transaction =
      contract.createTransaction("publishEnergyGenerationTestContext");
4 transaction.submit(generationBeginningTime, generationEndTime, "solar",
      randomGeneratedEnergy);
5
6 Transaction transaction = contract.createTransaction("registerSellBid");
7 byte[] transactionResult =
      transaction.submit(cmd.getOptionValue("energyamountkwh"),
8 cmd.getOptionValue("priceperkwh"), cmd.getOptionValue("energytype"));
9 ...
```
#### 5.3.3.4 Utility's application

The utility company application consists of a representative HTTP server receiving nonce and discount requests from buyers, as presented in Code [5.41.](#page-94-0) The nonce is solicited by clients who bought energy anonymously in the blockchain and increases the security of the discount request. The utility application performs the following steps before granting bill discounts to clients:

<span id="page-93-3"></span>1. Receive a discount request containing the client name, the ID of the transaction

that published their BuyBid, the idemix issuer public key, and the ID concatenated to the retrieved nonce.

- 2. Verify if the transaction stored a BuyBid in the blockchain.
- 3. Retrieve the idemix *pseudonym* that signed the *BuyBid* publishing transaction.
- 4. Verify if the same *pseudonym* generated the signature described in step [1.](#page-93-3)
- 5. Verify if the BuyBid was partially or fully matched in an auction.

Code 5.41 – Utility application [HTTP](#page-16-9) server resources and start

```
1 HttpServer server = HttpServer.create(new InetSocketAddress(80), 0);
2 server.createContext("/noncerequest" new NonceRequestHandler());
3 server.createContext("/discountrequest", new DiscountRequestHandler());
```

```
4 ExecutorService executor = Executors.newCachedThreadPool();
```
- 5 server.setExecutor(executor);
- 6 server.start();

## 5.3.3.5 Payment company's application

The payment company is also a representative HTTP that receives four types of requests displayed in Code [5.42.](#page-94-1) A buyer can put funds in their account by posting to the resource "/putfunds" and request a payment token to compose the BuyBid by posting to "/gettoken." After the BuyBid is published, the buyer will post to the "/validatebuybid" resource to require the payment company validation. After the auction, the seller will post to "/requestpayment" to get paid for the sold energy. At the execution beginning, the application retrieves all [CA](#page-16-8) [MSP'](#page-16-7)s certificates to attest later that a seller trying to request payment for an EnergyTransaction is the designated receiver.

<span id="page-94-1"></span>Code 5.42 – Payment company application [HTTP](#page-16-9) server resources and start

```
1 HttpServer server = HttpServer.create(new InetSocketAddress(81), 0);
```

```
2 server.createContext("/putfunds", new PutFundsHandler());
```

```
3 server.createContext("/gettoken", new GetTokenHandler());
```

```
4 server.createContext("/validatebuybid", new ValidateBuyBidHandler());
```
- 5 server.createContext("/requestpayment", new RequestPaymentHandler());
- 6 ExecutorService executor = Executors.newCachedThreadPool();

```
7 server.setExecutor(executor);
```

```
8 server.start();
```
## **5.3.4 Fabric-sdk-java logging and configurations**

It is possible to activate the fabric-sdk-java logging so the application execution might be tracked. Even though the instructions in the repository [\(TEAM, F.,](#page-138-1) [2020b\)](#page-138-1) claim that logging is enabled through environment variable settings, we achieve it by passing the flags in red presented in Code [5.3.4](#page-95-0) when we run an application. These two flags point to files that contain the logging configurations.

```
1 mvn exec:java@auction -Dexec.mainClass="applications.AppPeriodicAuction"
```

```
-Dexec.args="..." -Djava.util.logging.config.file=commons-logging.
```

```
2 properties -Dlog4j.configuration=log4j.properties
```
The [SDK'](#page-16-6)s Config class defines all default configurations regarding wait times, security parameters, maximum thread numbers, and other configurations. A "config.properties" file in the root of the maven project directory is necessary to override the default parameters. In this file, we only change the Service Discovery period to avoid frequent discovery requests and increase performance. We also change the orderer default response timeout.

## **5.3.5 Service Discovery x Network file description**

Fabric's java [SDK](#page-16-6) lets applications know the network topology, with peers, orderers, channels, and [CAs](#page-16-8), by performing a Service Discovery or reading a network description file. When an application starts, the network description file is always read to contact peers and orderers. Then, it can perform a Service Discovery to find out about all known peers, orderers, policies, and settings in the channel. After that, the next transactions are sent only to the needed number of endorsers based on the discovered channel policy.

Nothing prevents the network description file is solely used, but this practice can impact the overall channel transaction performance. Since the endorsement policies are unknown to the applications without Service Discovery, they will request endorsements for **all** known peers, even if the number of requests exceeds the quantity required by the endorsement policies.

A network with two organizations O1 and O2, running two peers each, with the endorsement policy determining that all organizations must sign every transaction clarifies the performance problem. An application transacting with the network, which uses a network description file containing all four peers, would request an endorsement for each one, even though only two peers would be needed. This does not represent a significant performance impact in a small-scale channel, while the opposite is true for large-scale channels dealing with multiple application instances.

Solving this problem is not as simple as describing the sufficient peers' quantity because the channel topology might change as a peer or orderer goes offline. That is why we opted for enabling the Service Discovery after analyzing both behaviors through logging and debugging. Its main performance advantage consists of alternating the endorsing peers, avoiding a bottleneck on a specific peer while making the least requests.

In our experiments with a private docker network, the Service Discovery worked properly when the applications were executed from an ubuntu docker container inside the network. Otherwise, despite the fabric-sdk-java overriding the hostname to localhost, it does not support port binding as configured with docker. We also changed the default Service Discovery period of 2 minutes to 20, as we considered it a reasonable time interval for preserving performance.

## 5.4 NETWORK AWS DEPLOYMENT

In the previous sections of this chapter, we explained the steps to deploy a localhost containerized blockchain network with a single chaincode and some applications. Experiments in a local context are difficult to scale and are not always representative of a real environment. For this reason, we created the necessary scripts and architecture to adapt the local deployment to an [AWS](#page-16-11) one.

[AWS](#page-16-11) offers vast cloud solutions with products and services related to many different knowledge areas, from databases to robotics. It counts on hosts located in the world's main regions and allows that customers choose where to applications are deployed. The users have a variety of machine configurations at their disposal, depending on resource requirements and budget.

### **5.4.1 Elastic Compute Cloud**

We selected the **[Elastic Compute Cloud \(EC2\)](#page-16-12)**, a virtual configurable computing environment, to deploy our cloud blockchain network. The general steps to set up a network go through selecting an operational system image (**AMI**), choosing the hardware configurations for each virtual machine (**instance**), and defining their storage type (**SSD**, **IOPS SSD**, **Hard disk**).

An [Amazon Machine Image \(AMI\)](#page-16-13) stores an operating system snapshot with configurations and applications and can be used by multiple instances. [AWS](#page-16-11) lists the available AMIs and, if they are public, anyone can start an instance, modify the system as wished, and store the changed [AMI.](#page-16-13) The supported architectures for images are i386, amd64, and arm64.

Instances are virtual servers with specific hardware configurations and launch from an [AMI.](#page-16-13) Each instance type runs in a specific processor architecture with determined virtual [Central Process Unit \(CPU\),](#page-16-14) [Random Access Memories \(RAM\),](#page-16-15) local storage, and network throughput quantities. For example, the instance type t2.micro

runs with a single intel virtual [CPU,](#page-16-14) 1 [Gibibyte \(GiB\)](#page-16-16) of [RAM,](#page-16-15) and low network performance. Meanwhile, the r6gd.metal type has 64 physical cores of an [AWS](#page-16-11) Arm Gravitron2 Processor, containing 512 [GiB](#page-16-16) of physical [RAM](#page-16-15) and network bandwidth up to 25 [Gigabits per second \(Gbps\).](#page-16-17)

The machines are instantiated in a Region, and more specifically, in an Availability Zone inside a Region. As an example, AWS has the South America East Region, located in Sao Paulo. Availability Zones represent different data centers within the Region bounds and reduce the single point of failure risk. If an application resides in multiple Availability Zones, a power shortage in one of them could be mitigated, as presented in Figure [20.](#page-97-0)

<span id="page-97-0"></span>

Figure 20 – [AWS](#page-16-11) Regions and Availability Zones

Source: [\(AUTHORS,](#page-134-0) [2021\)](#page-134-0)

## **5.4.2 ARM vs. x86-64 deploy and costs**

Powerful compute instances were required to run our experiments as close as possible to a real blockchain network for energy transactions - with many sellers, buyers, and sensors. We analyzed the costs to run instances with at least 32 cores and realized the cost disparity between arm and intel instances for budgeting the

experiments. The on-demand Linux pricing for the type m5.16xlarge (intel) was 3.232 [USD](#page-17-1) per hour, while the arm equivalent m6g.16xlarge cost 1.6191 USD per hour.

This 50% difference motivated us to deploy our experiments fully on arm instances, but the peer docker image had a hard-to-diagnose linking segmentation fault. We could solve the linking problem by forcing the docker images responsible for compiling the peer to link **statically**, with the changes displayed in Code [5.43.](#page-98-0) Besides, we changed the fabric-sdk-java dependency netty-tcnative-boringssl-static from version 2.0.34.Final to 2.0.35.Final due to a bad arm64 [Dynamic-link Library](#page-16-18) [\(DLL\)](#page-16-18) naming.

<span id="page-98-0"></span>Code 5.43 – Modification on Fabric's images/peer/Dockerfile to allow compilation in arm64 and static linking

```
1 ...
2 RUN apk add --no-cache \
3 binutils-gold \
4 ...
5 # peer must be built STATICALLY to run in arm64 docker
6 ENV CGO_ENABLED=0
7 RUN make peer GO_TAGS=${GO_TAGS}
8 ...
```
The deployment location also affects costs because AWS charges different prices for different Regions. Since our experiment is executed fully on the cloud, we could choose the cheapest location, Mumbai. As a reference, the same instance that cost 1.6191 [USD](#page-17-1) in Mumbai could cost up to 3.9168 [USD](#page-17-1) in Sao Paulo.

### **5.4.3 EnergyNetwork deploy steps in AWS**

The first step involved creating modified AMIs from the quick start Ubuntu Server 20.04 LTS (HVM) image (ami-0a6638920f7143fb2) for arm architecture. We started an instance with this quick start image and installed all required packages, including our patched fabric docker images, the fabric-sdk-java, and the fabric-gateway-java. The script "create-ami-arm.sh" in our Github repository [\(WESTPHALL,](#page-139-0) [2021\)](#page-139-0) was executed to generate our custom Ubuntu [AMI.](#page-16-13)

Next, we adapted the local docker deploy script to the "automated-aws-creation.sh" script, which receives the instance types as arguments, reads the configuration files and deploys the network in [AWS.](#page-16-11) Figure [21](#page-99-0) shows the high-level operations of the deployment with peers, orderers, a chaincode, and application instances. Localhost [CAs](#page-16-8) generate the certificates for the hostnames, or [Internet Protocol \(IP\)](#page-16-19) addresses allocated by [AWS](#page-16-11) to each instance.

<span id="page-99-0"></span>

Figure 21 – AWS deploy high-level sequence

Designed by the author

## **6 EXPERIMENTS**

This chapter describes the experiments performed locally, in a single machine, and in the [AWS](#page-16-11) cloud with multiple Cloud machines. Also, we define the experiments' objectives and explain some applied techniques to increase the network load in terms of scalability efficiently. In [AWS,](#page-16-11) we performed three phases of experiments with continuous load increases and instance upgrades to measure the network capacity. The data generation rate by the network referent to the experiment phases was also analyzed.

## 6.1 EXPERIMENT DESIGN GOALS

We designed our experiments to reach answers to our research questions about the scalability of blockchain energy trading with a guarantee of origin. The focus is on how a Hyperledger Fabric network running a chaincode to validate and transact energy, handling vast amounts of transactions. For that, we test different network configurations, varying the quantities of organizations, buyers, sellers, and sensors.

The frequency of transactions - energy validation, auction, buying, and selling is also configurable. With these settings, we can discover how a specific configuration change impacts the performance of the network. For example, the increase in the frequency of the sensors data publication might require more peers to keep the network operational.

## 6.2 EXPERIMENT ADAPTATIONS

Our applications and chaincode functions had to be adapted to support largerscale experiments. [HTTP](#page-16-9) servers and creating a certificate for each buyer, seller, and sensor had to be eliminated. Chaincode execution averages had to be calculated without affecting performance. In this section, we enumerate the required adaptations and briefly explain them.

## **6.2.1 Test applications**

The applications described in Section [5.3.3](#page-90-2) were adapted to simulate a higher number of buyers, sellers, and sensors. Each one has a specific purpose of simulating only one type of entity - buyer, seller, or sensor. These applications receive arguments about the transaction period, the number of transactions, path to certificates, or idemix credentials. The quantity of simulated sellers, buyers, or sensors is also passed as an argument and implies creating one **thread** per buyer, seller, or sensor.

To ensure that the auction happens periodically, we developed a specific appli-

cation that only calls the auction chaincode function and sleeps after that. The auction period is passed as an argument and is kept the same in an experiment round.

# **6.2.2 Bypassing entities identification from certificates' common names**

In our initial network deployment, the chaincode identified transactions' authors by the common names in the certificates. However, if we kept this design in our experiments, the required number of certificates would be proportional to the number of buyers, sellers, and sensors. This is not a problem in small tests, but it can be in larger experiments like ours.

Therefore, we enabled that the transaction author identified themselves by passing their names in the chaincode function parameter. For that, we added chaincode test functions that receive the author's name in order to identify them. Code [6.1](#page-101-0) displays an example of an adapted test function. The sellerID is informed by the chaincode caller, as presented in Code [6.2.](#page-101-1)

Code 6.1 – Chaincode function adapted to fetch ID from parameter

```
1 func (chaincode *EnergyChaincode) registerSellBidTestContext(stub
      shim.ChaincodeStubInterface, sellerID string, quantityKWH float64,
      pricePerKWH float64, energyType string) {...}
```
2 }

<span id="page-101-1"></span>Code 6.2 – Application function that calls the chaincode function and passes the sellerFullName as parameter

```
1 transaction = contract.createTransaction("registerSellBidTestContext");
```

```
2 transaction.submit("seller1-organization", ...);
```
# **6.2.3 One gateway per multiple entities of the same type to improve thread efficiency**

We utilize a single *gateway* to handle all the transaction submissions of a specific - buyer, seller, or sensor - simulated application. This avoids redundant connection thread creations to serve each simulated buyer, sensor, or seller. Code [6.3](#page-102-0) presents an example with the buyer's application. All threads simulating a buyer interact with the network through the same gateway instantiated, in line [1](#page-102-1) of Code [6.3.](#page-102-0) Otherwise, the capacity to simulate entities would decrease since more [CPU](#page-16-14) power would be allocated to the [Remote Procedure Calls \(gRPC\)](#page-16-20) threads.

**Observation**: On some rare occasions, the *[gRPC](#page-16-20)* java library shows exceptions logging messages - without actually throwing the exceptions - warning about channels previously open that were not properly shut down. This does not affect the delivery of transactions, and it is caused by dereferenced objects being finalized by the garbage collector instead of being explicitly shut down.

```
Code 6.3 – Same gateway for all buyer threads
```

```
1 try (Gateway gateway = builder.connect()) {
2 Network network = gateway.getNetwork("canal");
3 Contract contract = network.getContract("energy");
4 ...
5 for (int i = 1; i <= THREAD_NUM; i++) {
6 threads[i] = new Thread() {
7 ...
8 public void run() {
9 ...
10 contract.createTransaction("registerBuyBid");
11 ...
12 }
13 }
14 }
```
# **6.2.4 Sensor application without block event**

By default, the fabric-java-gateway always waits for the transaction commitment event after a submission. Unlike a buyer, which needs to wait for the BuyBid publication commitment to request the BuyBid validation, sensors simply push data to the chain and do not require knowing when the data is committed. Also, considering that the sensors' gateways might have processing constraints, listening to events should be disabled. We achieve this behavior by creating a specific network file description in which all peers are not set as event sources, as presented in Code [6.4.](#page-102-2)

```
Code 6.4 – Non-blocking conection-tls.json
```

```
1 "peers": {
2 "peer1-org1": {
3 ...
4 "eventSource": false,
5 },
6 "peer1-org2": {
7 ...
8 "eventSource": false,
9 }
10 }
```
#### **6.2.5 Discarding HTTP servers to improve experiment reliability**

The applications simulating the utility company's and payment company's [HTTP](#page-16-9) server were discarded in our experiments. As we intended to focus on measuring the blockchain performance, the risk of the [HTTP](#page-16-9) servers becoming the network bottleneck had to be eliminated. It is true that the discards also free some blockchain resources which would be required to respond to the companies' queries, making our experiments divert a little from a real deployed network. Nevertheless, we are sure that Hyperledger Fabric is the only one responsible for the measured performance limits.

The initially used Java [HTTP](#page-16-9) library (com.sun.net.httpserver.HttpServer) is not very scalable, as it blocks threads to perform chaincode calls. Considering this behavior, we did not want to increase this work's complexity by finding and analyzing another Java [HTTP](#page-16-9) library. However, we address joining back properly configured scalable [HTTP](#page-16-9) servers as future work.

Instead of the payment company validating the buy bid, the buyer application validates its published buy bids in our tests to bypass the companies' absence. Also, all sensors are considered trusted by all organizations to avoid the necessity of setting the trusted sensors for each organization in the experiment context.

**Observation**: even without the companies, we maintained the buyers and sellers auction event listeners that normally would trigger discount and payment requests. Since there are no companies in our tests, the buyers and sellers only query the chaincode to check if their bids were fully matched after receiving the auction event notification. Therefore, auction events and bid queries still represent a chaincode load.

#### **6.2.6 Measuring chaincode execution**

When a chaincode function is called, the execution time is measured and sent to a goroutine exclusively responsible for incrementally calculating the average time of each function to avoid overflow. Due to the same function being called simultaneously by multiple endorsing requests, this approach using a goroutine ensures that the writes to the averages are coordinated and prevents the endorsing requests from blocking until the average calculation.

Code [6.5](#page-104-0) shows the thread responsible for executing the transaction simulation. After the return, the *defer* function calculates the execution time and sends it to the goroutine ("thread") presented in Code [6.6.](#page-104-1) The calculation goroutine continuously listens to the channel *channelAverageCalculator* and recalculates the function

<span id="page-104-0"></span>execution time average when a new FunctionAndDuration is published.

```
Code 6.5 – Main execution "thread"
```

```
1 now := time.Now()
2 defer func() {
3 elapsed := time.Since(now)
4 channelAverageCalculator <- &FunctionAndDuration{functionName, elapsed}
5 }()
6 return functionPointer(stub, args)
```
Code 6.6 – Average calculation goroutine ("thread")

```
1 for {
2 functionNameAndDuration := <-channelAverageCalculator
3 /* recalculate the average */
4 }
```
## <span id="page-104-2"></span>**6.2.7 Limiting the number of sensors during validation**

In some cases, we increase the number of sensors to more than 1000. Since, in our experiments, we keep all sellers within an influence radius of the sensors, we established a maximum limit of **5** sensors per organization to validate an energy generation claim. This avoids the validation complexity to grow proportionally to the number of sellers times the number of sensors, which would be unrealistic in a real-life scenario.

At the first experiments, every sensor participated in the validation of every energy generation claim. However, we noticed that such settings started requiring increasingly powerful instances in tests with more than 1000 buyers, 1000 sellers, and 1000 sensors. Therefore, scalability tests containing more than 10000 seemed infeasible. The **5** sensor maximum made our experiments closer to a real-life scenario while keeping the sensors' load related to SmartData publishing and allowing further scalability tests.

#### 6.3 EXPERIMENT ROUNDS

We structured our scripts to execute experiments in rounds, which are defined by a set of configurations and results. The configurations encompass blockchain configurations, like the number of orderers, and application configurations, like the sensors quantity. Results describe metrics and statistics within a single experiment round.

## **6.3.1 Experiment round configuration**

Each experiment round has its own set of configurations regarding the blockchain - peers, orderers, organizations - and the applications - buyers, sellers, sensors, transaction frequency. The following configurations are determined before network creation:

- 1. Organizations.
- 2. Number of peers.
- 3. Number of orderers.
- 4. Number of application instances.
- 5. Peer concurrency limits.
- 6. Peers [AWS](#page-16-11) instance type.
- 7. Orderers [AWS](#page-16-11) instance type.
- 8. Applications [AWS](#page-16-11) instance type.
- 9. Batch size.
- 10. Batch timeout.

After the network creation, multiple experiments might be performed, but the only possible configuration changes are related to the applications, displayed in Code [6.7.](#page-105-0) Experiments with different blockchain configurations require full network recreation.



<span id="page-105-0"></span>



### **6.3.2 Experiment round results**

During an experiment round, the peers', chaincodes', orderers', and applications' metrics are continuously fetched through [Secure Shell \(SSH\)](#page-17-2) and dumped into files. Code [6.8](#page-106-0) displays an example of how we do that. The sshCmdBq function connects to an instance and executes the "docker stats" command in the background until all applications finish their transactions. These [CPU,](#page-16-14) memory, network, and disk stats are later processed by a python script that generates plots from the data.

Code 6.8 – Fetching orderers' stats

<span id="page-106-0"></span>1 sshCmdBg \${hosts[orderer\$i-\$orgName]} docker stats --format "{{.CPUPerc}}:{{.MemUsage}}:{{.NetIO}}:{{.BlockIO}}" orderer\$i-\$orgName > \$testFolder/stats-orderer\$i-\$orgName.txt

The initial and final file system sizes of peers and orderers are also measured to identify how much data an experiment round generated. We periodically get the average execution time of each chaincode function. In the end, we retrieve the peers', orderers', and applications' logs to verify if any abnormal behavior happened. Eventually, when stress testing the network, some transactions might be rejected, or connection timeouts might appear in the logging files.

## 6.4 EXPERIMENTS WITH DIFFERENT AWS INSTANCES

We evaluated the [AWS](#page-16-11) instances' performance in a context with **one orderer**, **one peer**, and **one or two application instances**. Algorithm [1](#page-107-0) provides a highlevel idea about how we performed these experiment tests. We started with the limited arm instance  $t4q.micro$  for the peer, orderer, and application. The test load was constantly increased by growing the number of sellers, buyers, and sensors until the log indicated failures.

When the logs presented failures, we interpreted the test result to find what instance - peer, orderer, or application - needed upgrade to support the test load or if some Hyperledger Fabric's configuration should be changed. After the instance upgrade or configuration change, the experiment round was run again with the same load and was expected to work.

# <span id="page-107-0"></span>**Algorithm 1** Experiment tests 1: **procedure** TestInstancesLimit 2: *peerInstance* ← "*t*4*g*.*micro*" 3: *ordererInstance* ← "*t*4*g*.*micro*" 4: *applicationsInstance* ← "*t*4*g*.*micro*" 5: *testConfiguration* ← getSmallLoadConfiguration 6: **while** weWantToPerformAnotherRound **do** 7: *logs* ← runExperimentRound(*testConfiguration*) 8: **if** logsPresentsErrors(*logs*) **then** 9: *configurationNeedsChange* ← identifyConfigChangeNeed(*logs*) 10: **if** *configurationNeedsChange* **then** 11: *testConfiguration* ← changeSomeFabricConfig(*testConfiguration*) 12: **continue** 13: **end if** 14: *entityToBeUpgraded* ← identifyWhoNeedsUpgrade(*logs*) 15: **if** *entityToBeUpgraded* = "*peer*" **then** 16: *peerInstance* ← upgradeInstance(*peerInstance*) 17: **else if** *entityToBeUpgraded* = "*orderer*" **then** 18: *ordererInstance* ← upgradeInstance(*ordererInstance*) 19: **else** 20: *applicationsInstance* ← upgradeInstance(*applicationsInstance*) 21: **end if** 22: **else** 23: *testConfiguration* ← increaseLoad(*testConfiguration*) 24: **end if** 25: **end while** 26: **end procedure**

# **6.4.1 Phase 1 experiment**

The first phase of the experiments ran with all sensors participating in all energy validations. It raised our awareness about limiting the number of sensors, as discussed in Section [6.2.7](#page-104-2) after analyzing the steep average time increase of the energy validation function execution. This phase's results are discussed in Section [7.2.1.](#page-117-0)

In Phase 1, the transaction publication quantities and intervals of each entity type were equivalent to the displayed in Code [6.7.](#page-105-0) Nevertheless, the numbers of sellers, sensors, and buyers were varied. This phase ended with a very specific failure regarding the **peer endorsing concurrency limit**, set by default to **2500** concurrent endorsing requests.

# **6.4.2 Phase 2 experiment**

In the Phase 2 experiments, we increased the peer's concurrency limit and avoid this failure, provided that the peer instance has the required computing power.
The limit was set to 1 million concurrent requests to practically eliminate any concurrency restrictions, even though we never experiment with 1 million concurrent transactions. As in Phase 1, besides the number of buyers, sellers, and sensors, the Phase 2 configuration was the same as presented by Code [6.7.](#page-105-0)

We also increased the chaincode container [RAM](#page-16-0) allocation since the chaincode started to respond to more simultaneous requests after the concurrency limit increase. The number of sensors participating in each energy generation validation was limited to **5** to represent a more realistic scenario. This phase's results are presented in Table [6](#page-119-0) in Section [7.2.2.](#page-118-0)

#### **6.4.3 Phase 3 experiment**

The authors of [\(MOON et al.,](#page-137-0) [2019\)](#page-137-0) recommend a larger block size in Hyperledger Fabric environments with high throughput and lower latency demands. Considering that, in Phase 3, we performed tests with different block sizes and block timeout values. The results are presented in Table [7](#page-122-0) and discussed in Chapter [7.](#page-110-0)

These configurations are set in the "configtx.yaml" file of the network being deployed. Code [6.9](#page-108-0) presents the parameters that deal with block configurations, containing brief documentation explaining each field. The term "batch" can be considered equivalent to "block." The results of this phase are presented and discussed in Section [7.2.3](#page-119-1)

<span id="page-108-0"></span>Code 6.9 – Hyperledger block configuration parameters in "configtx.yaml"

```
1 Orderer: &OrdererDefaults
2 + ...3 BatchTimeout: 2s
4 BatchSize:
5
6 # Max Message Count: The maximum number of messages to permit in a
7 # batch. No block will contain more than this number of messages.
8 MaxMessageCount: 500
Q10 # Absolute Max Bytes: The absolute maximum number of bytes allowed for
11 # the serialized messages in a batch. The maximum block size is this value
12 # plus the size of the associated metadata (usually a few KB depending
13 # upon the size of the signing identities). Any transaction larger than
14 # this value will be rejected by ordering...
15 AbsoluteMaxBytes: 10 MB
16
17 # Preferred Max Bytes: The preferred maximum number of bytes allowed
18 # for the serialized messages in a batch. Roughly, this field may be considered
19 # the best effort maximum size of a batch. A batch will fill with messages
20 # until this size is reached (or the max message count, or batch timeout is
21 # exceeded). If adding a new message to the batch would cause the batch to
22 # exceed the preferred max bytes, then the current batch is closed and written
23 # to a block, and a new batch containing the new message is created. If a
24 # message larger than the preferred max bytes is received, then its batch
25 # will contain only that message. Because messages may be larger than
26 # preferred max bytes (up to AbsoluteMaxBytes), some batches may exceed
```
#### 27 # the preferred max bytes, but will always contain exactly one transaction. 28 PreferredMaxBytes: 2 MB

### 6.5 DATA GENERATION RATE EXPERIMENTS

Sensors continuously sending SmartData to the blockchain coupled with energy bid submissions might generate a huge amount of data, and knowing this data generation rate can point to network limitations. For that reason, we evaluated the data quantity generated in Phases 2 and 3 - with sensors, buyers, and sellers.

The peer's and orderer's root ("/") file systems' sizes were measured before and after the experiment rounds. We intended to draw conclusions discussing whether or not the data rate could be considered a problem with the results.

## <span id="page-110-0"></span>**7 RESULTS AND DISCUSSION**

In this Chapter, we present the results of our experiments. The preliminary metrics were taken during the chaincode development to maximize the database queries speed. We compare CouchDB and LevelDB after running some of our chaincode's functions with each one of them. LevelDB presented an overall better performance for the queries executed. The results from the three experiment phases are displayed, discussed, and compared with the related work solutions and proposals. We estimate the data generation rate and the cost of our implementation.

#### 7.1 PRELIMINARY METRICS

The preliminary metrics provided base metrics to decide on the best performance chaincode design. We compared the time to retrieve a set of ledger States between CouchDB and LevelDB queries. The time measures were taken in a single machine with two orderers, two peers, and two CouchDBs for each peer, all running in docker containers. The preliminary metrics' intent is not to estimate the World State's access time in a real deployment context but to find the differences between the two databases, which will likely be proportional in a real deployment.

Our chaincode final version serializes the structs using [gRPC](#page-16-1) to take advantage of more efficient storage. However, at the time of these preliminary experiments, the chaincode serialized structs to **[JSON](#page-16-2)** format, which is required for using CouchDB with Hyperledger Fabric.

### **7.1.1 CouchDB vs. Go LevelDB**

Hyperledger Fabric supports CouchDB and LevelDB as database solutions to the ledger and World State. In this context, we measured some preliminary database query times to decide the most appropriate database. Our initial metrics involved querying SmartData in a determined timestamp range from the World State. The other two queries regarded retrieving SellerInfo by its SmartMeter ID and fetching SellBids/BuyBids to perform the double auction. Based on the metrics, LevelDB was considered more appropriate for our chaincode than CouchDB.

At first sight, it might seem obvious that a CouchDB running as an extra docker container, communicating with the peer using the network, and performing [JSON](#page-16-2) queries would be slower than a LevelDB peer-local with only Key-Value queries. However, we considered that [JSON](#page-16-2) queries could filter more data at the database, optimize network usage, and avoid data filtering on the chaincode. Also, we created indexes for the [JSON](#page-16-2) queries, as recommended in Hyperledger Fabric's documentation, for optimization [\(TEAM, F. D.,](#page-139-0) [2020b\)](#page-139-0).

Since we performed these preliminary experiments in a single machine, the network delay effect was almost irrelevant on the communications between peers and its CouchDB instance and between the peer and its chaincode instance. Code [7.1](#page-111-0) presents how the network delay was calculated by performing near 100 round trips with the Linux ping command. The CouchDB settings in our experiments are presented in Code [7.2.](#page-111-1)

Code 7.1 – Round trip peer to CouchDB and peer to chaincode

```
1 $ ping "couchdb-address"
2 ...
3 round-trip peer<-->couchdb min/avg/max = 0.063/0.077/0.156 ms
4
5 $ ping "chaincode-address"
6 ...
7 round-trip peer<-->chaincode min/avg/max = 0.050/0.073/0.165 ms
```
<span id="page-111-1"></span>



## 7.1.1.1 Querying SmartData by timestamp range

The SmartData by timestamp query is part of the energy validation process. The trusted near sensors are selected, and their published SmartData serve as references to validate the alleged energy production. The seller informs a timestamp range, representing the period when they generated the energy. We evaluated the performance of three ways to retrieve the smart data:

- 1. Using CouchDB, with a [JSON](#page-16-2) query and function shim.ChaincodeStubInterface.- GetQueryResult() with the operator \$in
- 2. Using CouchDB, with a [JSON](#page-16-2) query and function shim. ChaincodeStubInterface.-GetQueryResult() without the operator \$in
- 3. Using CouchDB, with the function shim.ChaincodeStubInterface.GetStateBy-Range()
- 4. Using LevelDB, with the function shim.ChaincodeStubInterface.GetStateBy-Range()

Codes [7.3](#page-112-0) and [7.4](#page-112-1) contain the measured queries available only with CouchDB, one with the \$in operator, which requires only one query, including all sensors IDs. The other query is performed per near trusted sensor. Code [7.5](#page-113-0) shows the index for the SmartData stored in the World State, containing the fields timestamp and assetid, corresponding to the same fields in our [JSON](#page-16-2) query.

<span id="page-112-0"></span>Code 7.3 – Query with GetQueryResult() using the \$in operator, possible only with CouchDB

```
1 assetsIDs := "["
2 for _, nearTrustedActiveSensor := range *nearTrustedActiveSensors {
 3 assetsIDs += '"' + nearTrustedActiveSensor.MspID +
           nearTrustedActiveSensor.SensorID + '",'
\overline{4}5 assetsIDs = assetsIDs[:len(assetsIDs)-1] + "]"
 6
 7 queryString := fmt.Sprintf('{"selector":{"timestamp":{"$gt":
       %d},"timestamp":{"$lt": %d},"assetid":{ "$in": %s }}}', t0, t1,
       assetsIDs)
8 queryIterator, err := stub.GetQueryResult(queryString)
9 ...
10 }
```
# <span id="page-112-1"></span>Code 7.4 – Query with GetQueryResult() for each near trusted sensor, possible only with CouchDB



```
5 queryIterator, err := stub.GetQueryResult(queryString)
6
7 }
```
Code 7.5 – SmartData CouchDB index

```
1 {
2 "index":{
3 "fields":["timestamp","assetid"]
4 },
5 "ddoc":"indexSmartDataDoc",
6 "name":"indexSmartData",
7 "type":"json"
8 }
```
The queries performed with the function GetStateByRange(), as shown in Code [7.6,](#page-113-1) return all states with keys in the range [startKey, endKey[, considering the lexicographical order. Since the SmartData keys end with a 20 character timestamp, it is possible to use this function to fetch the sensor published SmartData in the interval  $[t0, t1$ [.

<span id="page-113-1"></span>Code 7.6 – Query with GetStateByRange(), possible with both CouchDB and LevelDB

```
1 objectType = "SmartData"
2 for _, nearTrustedActiveSensor := range *nearTrustedActiveSensors {
3 startKey := objectType + nearTrustedActiveSensor.MspID +
         nearTrustedActiveSensor.SensorID + getMaxUint64CharsStrTimestamp(t0)
4 endKey := objectType + nearTrustedActiveSensor.MspID +
         nearTrustedActiveSensor.SensorID + getMaxUint64CharsStrTimestamp(t1)
5 queryIterator, err := stub.GetStateByRange(startKey, endKey)
6 ...
7 }
```
We repeated the queries 100 times for each of the two near trusted sensors. There were 2000 SmartData stored in the World State, all of them sent by one sensor. Table [2](#page-114-0) exhibits the settings and time to perform a query quantity for each query presented in Codes [7.3,](#page-112-0) [7.4,](#page-112-1) and [7.6.](#page-113-1) In the specific case of Table [2](#page-114-0) first line, we performed 100 queries total because both sensor IDs were placed in the same query.

<span id="page-114-0"></span>



## 7.1.1.2 Querying SellerInfo

Every time a new seller is registered, the chaincode checks if their Smart-MeterID is not already associated with another seller. When a smart meter or its gateway publishes an energy generation claim, the SellerInfo related to that smart meter must be fetched so that the energy generated can be linked to the seller. There are two possible ways to accomplish both searches, one is presented in Code [7.7,](#page-114-1) with a [JSON](#page-16-2) query, and the other is presented in Code [7.8,](#page-114-2) with the GetState() function.

Code 7.7 – Query with GetQueryResult(), possible only with CouchDB

```
1 queryString :=
     fmt.Sprintf('{"selector":{"mspsmartmeter":"%s","smartmeterid":"%s"}}',
     meterMspID, meterID)
2 queryIterator, err := stub.GetQueryResult(queryString)
3 ...
4 if queryIterator.HasNext() {
5 queryResult, = := queryIterator.Next()
6 sellerInfoBytes = queryResult.Value
7 }
```
<span id="page-114-2"></span>Code 7.8 – Query with GetState(), possible with both CouchDB and LevelDB

```
1 objectType := "MeterSeller"
```

```
2 key, err := stub.CreateCompositeKey(objectType, []string{meterMspID,
      meterID})
```

```
3 meterSellerBytes, err := stub.GetState(key)
```

```
4 if meterSellerBytes == nil {
```

```
5 return sellerInfo, fmt.Errorf("No meter of MSP %s and ID %s",
          meterMspID, meterID)
6 }
7 err = json.Unmarshal(meterSellerBytes, &meterSeller)
8
9 objectType = "SellerInfo"
10 key, err = stub.CreateCompositeKey(objectType,
      []string{meterSeller.MspIDSeller, meterSeller.SellerID})
11 sellerInfoBytes, err = stub.GetState(key)
12 if sellerInfoBytes == nil {
13 return sellerInfo, fmt.Errorf("No seller related to the meter of
              MSP %s and of Smart Meter ID %s", meterMspID, meterID)
14 }
```
Table [3](#page-115-0) presents the time to perform 100 queries, presents the time to perform 100 queries, given a certain query method and SellerInfo quantity stored in the World State. Based on the time column, it is possible to conclude that, besides LevelDB having the best performance, the SellerInfo quantity stored in the World State does not significantly influence when its full key fetches speed.

<span id="page-115-0"></span>

Settings and time Database - query method	State in World #SellerInfo	queries $\mathcal{P}^{\mathsf{t}}$ Number	queries $\overline{\overline{6}}$ perform S, e E
CouchDB-JSON GetQueryResult		100	1.3593487s
CouchDB-JSON GetQueryResult	2000	100	1.1544551s
CouchDB-GetState		100	233.0843ms
CouchDB-GetState	2000	100	220.8931ms
LevelDB-GetState		100	235.5689ms
LevelDB-GetState	2000	100	212.9267ms

Table 3 – Time and settings to fetch SellerInfo by different methods

## 7.1.1.3 Querying sorted buy/sell bids to perform the auction

During the auction, the validated BuyBids and the SellBids must be sorted in the, respectively, descending order and ascending order. CouchDB [JSON](#page-16-2) queries provide a mechanism to request the sorted list of a struct, requiring the declaration about what field should determine the order. Code [7.9](#page-116-0) displays an example of this type of query, showing a query to fetch the SellBids in the ascending ("asc") order and the BuyBids in the descending ("desc") order, based on the field priceperkwh.

Another possible form to obtain the sorted lists is presented in Code [7.10.](#page-116-1) The SellBids and validated BuyBids are fetched by their partial key and sorted using a golang sort library during the chaincode execution. The sort.Slice() function calls quicksort.

# <span id="page-116-0"></span>Code 7.9 – Querying price-sorted SellBids and validated BuyBids to CouchDB through a [JSON](#page-16-2) query



<span id="page-116-1"></span>Code 7.10 – Querying SellBids and validated BuyBids using the function GetState-ByPartialCompositeKey() and sorting them. Possible with both CouchDB and LevelDB

```
1 //get SellBids
 2 objectType = "SellBid"
 3 sellBidsIterator, err := stub.GetStateByPartialCompositeKey(objectType,
       [ string\{\})
4 //get VALIDATED BuyBids
 5 objectType = "BuyBid"
 6 buyBidsIterator, err := stub.GetStateByPartialCompositeKey(objectType,
       []string{"true"})
 7
 8 ...
9 // Sorting part (Quicksort)
10 //sort SellBids in ASCENDING order
11 sort.Slice(sellBids[:], func(i, j int) bool {
```


We measured the times to perform a single auction and a hundred auctions sequence for the solutions presented in Codes [7.9](#page-116-0) and [7.10](#page-116-1) - exhibited in Table [4.](#page-117-0) We captured the single auction measure to have a clean time reference since the 100 auction sequence was performed in a single transaction, which we considered could suffer some optimization due to the query repetition.

<span id="page-117-0"></span>

Settings and time Database - query method	w SellBid ᡃᡃᡠ Numbe	uyBids b ৳ Numbe	ctions È ൹ ৳ Numbe	auction the perform ٩, ۴	Avarage time/auction
CouchDB-JSON GetQueryResult sorted by CouchDB	5000	1000	1	22.36s	22.36s
CouchDB-JSON GetQueryResult sorted by CouchDB	5000	1000	100	39m52.44s	23.92s
CouchDB-GetStateByPartialCompositeKey sorted in chaincode	5000	1000	1	8.65s	8.65s
CouchDB-GetStateByPartialCompositeKey sorted in chaincode	5000	1000	100	12m20.06s	7.4s
LevelDB-GetStateByPartialCompositeKey sorted in chaincode	5000	1000	1	2.56s	2.56s
LevelDB-GetStateByPartialCompositeKey sorted in chaincode	5000	1000	100	3m26.04s	2.06s

Table 4 – Time and settings to perform auctions, executing different methods to fetch sorted SellBids and sorted validated BuyBids

# 7.2 **EXPERIMENT RESULTS**

This section presents and discusses our main 3-phase experiments with our proposal's implementation. With the experiment metrics we analyze the transaction throughput, data generation rate, and estimated deployment costs. Then, the model's viability is addressed, followed by a comparison with the related work solutions.

# **7.2.1 Phase 1 experiment results**

The first phase of the experiments ran with all sensors participating in all energy validations. It raised our awareness about limiting the number of sensors, as discussed in Section [6.2.7.](#page-104-0) Some configurations and results of the first phase are

presented in Table [5.](#page-118-1) Each row represents a configuration that failed in an experiment round. The first column contains which entity - application, orderer, or peer - indicated failure, with the [AWS](#page-16-3) instance name highlighted in red. An instance upgrade happened after every failure, usually related to not properly supporting the experiment processing demands.

The rightmost columns of Table [5](#page-118-1) present the numbers of sellers, sensors, and buyers for each round that presented a failure. We had to upgrade the instances to continuously increase the network participant capacity and go from 600 to 3000 sellers, sensors, and buyers.

Table [5](#page-118-1) last line shows a very specific failure regarding the **peer endorsing concurrency limit**, which is set by default to **2500** concurrent endorsing requests. In the Phase 2 experiments described in Section [7.2.2,](#page-118-0) we increase this limit and avoid such failure, provided that the peer instance has the required computing power.

<span id="page-118-1"></span>

Settings Who failed	number Round	instance App	instance Orderer	instance Peer	sellers ৳ Number	sensors ď Number	buyers $\overline{\sigma}$ Number
application	1	t4g.micro	t4g.micro	t4g.micro	200	200	200
peer	2	t4g.xlarge	t4g.micro	t4g.micro	400	400	400
orderer	3	t4g.xlarge	t4g.micro	t4g.xlarge	600	600	600
peer	$\overline{4}$	t4g.xlarge	t4g.xlarge	t4g.xlarge	600	600	600
application	5	t4g.xlarge	t4g.xlarge	t4g.2xlarge	600	600	600
orderer	6	t4g.2xlarge	t4g.xlarge	t4g.2xlarge	800	800	800
peer (concurrency limit)	$\overline{7}$	t4g.xlarge	t4g.2xlarge	$t4q.2x$ large	1000	1000	1000

Table 5 – Configurations that lead to failure in Phase 1

## <span id="page-118-0"></span>**7.2.2 Phase 2 experiment results**

Table [6](#page-119-0) presents the results of the Phase 2 experiment. We could scale the network capacity from 2000 sellers, 2000 sensors, and 2000 buyers, in the first round, to 3500 sellers, 3500 sensors, and 3500 buyers in the last one. The orderer had to be upgraded up to c6g.4xlarge [AWS](#page-16-3) instance, with 8 cores, 32 [GiB,](#page-16-4) and 10 [Gbps](#page-16-5) network capacity. The peer had to be scaled to the  $c6q.8x$ large instance, with 16 cores, 64 [GiB](#page-16-4) of [RAM,](#page-16-0) and up to 25 [Gbps](#page-16-5) network.

Only **5** sensors were selected to validate energy generation claims in this phase, different from Phase 1. This was probably the main reason for the increase in the network participant capacity. In round 4, the chaincode had a memory limit failure, as demonstrated by Figures [22](#page-120-0) and [23.](#page-121-0)

Both figures are graphs of chaincode container instantaneous memory usage in [GiB.](#page-16-4) In the failure round, corresponding to Figure [22,](#page-120-0) the chaincode memory abruptly increased to 1.75 [GiB](#page-16-4) and then went negative - indicating container failure. The memory allocated for the chaincode was 2 [GiB.](#page-16-4)

After the chaincode container memory was upgraded to 4 [GiB,](#page-16-4) the chaincode presented a memory usage of a little over 2 [GiB,](#page-16-4) in Figure [23,](#page-121-0) indicating that the chaincode crashed before due to lack of available memory. We even allocated 12 [GiB](#page-16-4) to the chaincode to prevent this failure from happening in the following experiment rounds.

The last three experiment rounds demonstrate the difficulty of increasing sellers, sensors, and buyers. Despite three consecutive upgrades, the logs always presented some type of failure indication regarding network capacity. These results made us end Phase 2 and start Phase 3.

<span id="page-119-0"></span>

Settings Who failed	number Round	instance App	instance Orderer	Peer instance	ပ္ပ selle ৳ Number	sensors đ Number	buyers Ⴆ Number
application	1	t4g.2xlarge	t4g.2xlarge	t4g.2xlarge	2000	2000	2000
orderer	2	c6g.4xlarge	t4g.2xlarge	t4g.2xlarge	2000	2000	2000
peer	3	c6g.4xlarge	c6g.4xlarge	t4g.2xlarge	2700	2700	2700
peer (chaincode mem limit 2 GiB)	4	c6g.4xlarge	c6g.4xlarge	c6g.4xlarge	3000	3000	3000
application/peer	5	c6g.4xlarge	c6g.4xlarge	c6g.4xlarge	3500	3500	3500
application	6	c6g.8xlarge	c6g.4xlarge	c6g.8xlarge	3500	3500	3500
orderer	7	c6g.16xlarge	c6g.4xlarge	c6g.8xlarge	3500	3500	3500

Table 6 – Configurations that lead to failure in Phase 2

# <span id="page-119-1"></span>**7.2.3 Phase 3 experiment results**

The two previous experiment phases had the default maximum block interval of **2s**, with at most **500** transactions in a block or the maximum block preferred size of **2MB**. The last three lines of Table [6](#page-119-0) indicate difficulties in scaling beyond 3500 sellers, 3500 sensors, and 3500 buyers. We tested different block intervals, maximum transaction numbers, and maximum preferred block sizes in this phase, expecting to increase the scalability limits achieved in Phase 2.



<span id="page-120-0"></span>Figure 22 – Chaincode memory data in failure round (round 4)

Designed by the author

We considered the average transaction size of 4 [Kilobyte \(KB\)](#page-16-6) to keep always a Block preferred size with the capacity to fit Block transaction limit transactions. Otherwise, the blocks' creation would be triggered by the surpass of the Block preferred size and would never group Block transaction limit transactions.

Round **1** of this phase, in Table [7,](#page-122-0) presented failures in the application's instance, indicating resource exhaustion. Thus, after round 1, we added a second application instance to divide the sensors, sellers, and buyers simulation load. For example, instead of making a single application instance simulate 3500 buyers, two instances simulate 1750 buyers each.

Unlike the previous phases, in this one, we decided to include the successful experiment rounds to explicit the network configurations that worked properly. In round 2, all logs indicated a successful execution when dealing with 3500 sensors, 3500 sellers, and 3500 buyers simultaneously.

In the third round, we tried to increase the quantity of each entity type to 5000 and failed, but round 4 made clear that the Block transaction limit should be increased from 2000 to 10000 maximum transactions in a single block to run without errors. After performing tests with 6000 sellers, 6000 sensors, and 6000 buyers in round 5, the chaincode container ran out of memory, and we allocated 12 [GiB](#page-16-4) for the following rounds.

Rounds 6 through 8 failed due to excessive reporting of orderer timeout in the

<span id="page-121-0"></span>

Figure 23 – Chaincode memory usage post increase



applications' logs, which was **60 seconds**. This means that after sending transactions to the orderer, the applications repeatedly did not receive a response after 60 seconds. Thus, the Hyperledger Fabric network could not absorb such high throughput with the configurations displayed in Table [7.](#page-122-0)

In round 7, we upgraded the orderer instance to a c6g.16xlarge [AWS](#page-16-3) instance and increased the Block transaction limit to 20000. After it failed, our final experiment round had a 20 second Block interval and 30000 maximum messages per block. However, the final round also presented excessive orderer timeouts and was classified as a failure.

It is important to emphasize that if the applications' orderer timeout limit was set to a value greater than 60 seconds, rounds like the 7<sup>th</sup> would probably run without error indications. Still, that was **our** criteria for an acceptable orderer timeout, even though we recognize that it depends on the application scenario.

<span id="page-122-0"></span>

Settings Who failed	৳ numb Round	instance App	Orderer instance	instance Peer	sellers ৳ Number	ensors ū $\rm 5$ Number	buyers $\rm ^{+}$ Number	σ interva <b>Block</b>	limit <b>Block transaction</b>	size <b>Block</b> preferred
application (add new app instance)	1	c6g.16xlarge	c6g.8xlarge	c6g.8xlarge	3500	3500	3500	10 <sub>S</sub>	2000	60 MB
<b>SUCCESS</b>	2	c6g.16xlarge	c6g.8xlarge	c6g.8xlarge	3500	3500	3500	10 <sub>S</sub>	2000	60 MB
orderer (Low block transaction limit)	3	c6g.16xlarge	c6g.8xlarge	c6g.8xlarge	5000	5000	5000	10 <sub>s</sub>	2000	60 MB
SUCCeSS.	$\overline{4}$	c6g.16xlarge	c6g.8xlarge	c6g.8xlarge	5000	5000	5000	10 <sub>S</sub>	10000	60 MB
peer (chaincode mem limit 8 GiB)	5	c6g.16xlarge	c6g.8xlarge	c6g.8xlarge	6000	6000	6000	10 <sub>s</sub>	10000	60 MB
orderer	6	c6g.16xlarge	c6q.8xlarge	c6g.8xlarge	6000	6000	6000	10 <sub>S</sub>	10000	60 MB
orderer	7	c6g.16xlarge	c6g.16xlarge	c6g.8xlarge	6000	6000	6000	10 <sub>S</sub>	20000	90 MB
orderer	8	c6g.16xlarge	c6g.16xlarge	c6g.8xlarge	6000	6000	6000	20 <sub>s</sub>	30000	150 MB

Table 7 – Round configurations in Phase 3

**Observation**: We identified that the peer auction events were not sent to the applications in this phase. This prevented the auction transactions from being called, and that sell bids were matched to buy bids. However, the auction transactions represent an irrelevant share of all transactions in a throughput perspective - lower than 0.02%. The cause of such failure was not identified. It could have been caused by the higher peer demand or by the larger batch interval. Thus, regardless of this small failure, the orderer could handle the transaction throughput indicated as "success" by Table [7.](#page-122-0)

## <span id="page-122-1"></span>7.3 DATA GENERATION RATE

Every experiment round in Phases 1, 2, and 3 measured the orderer's and peer's file system size to identify the proportion of data generation rate. The file systems were measured at two distinct moments. First, at the round beginning before any application issued any transaction to the network. Second, after all the applications published all their transactions.

Tables [8](#page-123-0) and [9](#page-123-1) present, respectively, the orderer's and peer's file system sizes corresponding to the experiment rounds performed in Phase 3. The file systems' sizes presented in Tables [8](#page-123-0) and [9](#page-123-1) are proportional to the number of sellers, sensors, and buyers. Tables [10](#page-123-2) and [11](#page-124-0) present the data generated in a successful round of experiment Phase 2.

 $\bar{z}$ 

 $\sim 10^{-10}$ 

 $\sim$ 

<span id="page-123-0"></span>

Settings Phase 3 round	'n, seller ৳ 0e $\vec{z}$	w senso ᡃᡃᡖ Number	ღ buyer 'ত umbe z	size Initial	size Final	rated gener Data
2 (success)	3500	3500	3500	289 MB	897 MB	608 MB
4 (success)	5000	5000	5000	289 MB	1178 MB	889 MB

Table 8 – Orderer data generation in Phase 3

<span id="page-123-1"></span>

Settings Phase 3 round	w Φ gg 'ত Φ ј z	'n senso ð Numbe	Ņ٦ buyer ৳ Number	Φ $\frac{1}{2}$ hitial	size Final	generated Data
2 (success)	3500	3500	3500	53 MB	597 MB	544 MB
4 (success)	5000	5000	5000	53 MB	833 MB	780 MB

Table 9 – Peer data generation in Phase 3

<span id="page-123-2"></span>

Settings Phase 2 round	ω Ū ৳ በ	m w ΘS ъ α	n ъ đ١ 7	size Initial	Φ N ِ آن ω ۴in	ate Φ ge ere
<b>SUCCESS</b>	3000	3000	3000	1564 MB	2146 MB	582 MB

Table 10 – Orderer data generation in successful Phase 2 round

<span id="page-124-0"></span>

Settings Phase 2 round	n ወ $\pmb{\mathsf{U}}$ Ū Ⴆ ወ z	n ū θŚ 'ਨ G)	S Ⴆ z	Φ $rac{1}{5}$ Initial	በ N <u>'ত</u> ᠬᠦ ïΞ	$\omega$ ෆ ത
<b>SUCCESS</b>	3000	3000	3000	1318 MB	1928 MB	610 MB

Table 11 – Peer data generation in successful Phase 2 round

Different from Phase 3, in Phase 2, the auction happened periodically, generating proportionally more data. This becomes evident comparing the data generation in round **2** of Phase 3 (Tables [8](#page-123-0) and [9\)](#page-123-1) with the **successful** round of Phase 2 (Tables [10](#page-123-2) and [11\)](#page-124-0). Even with fewer network participants, the round in Phase 2 generated just 26 MB less in the orderer and 76 MB more in the peer.

Therefore, to achieve better precision, we utilize the Phase 2 data generation and execution time to make estimates for longer periods. As stated in Code [6.7,](#page-105-0) each sensor published **20** transactions plus one declaring itself active. Each seller performed **5** energy generation and **5** sell bid publication transactions, while the buyers submitted **10** buy bids and **10** buy bid validation transactions. **Twenty-nine** auctions were executed in the successful Phase 2 round.

Considering that the round took 27 minutes to complete and generate the data quantity presented by Tables [10](#page-123-2) and [11,](#page-124-0) we could estimate how much storage would be required to support the network execution with the same configurations for longer periods. The estimates for the data generated in a day, month, and year are presented in Table [12.](#page-125-0) Such estimates were calculated lineary, as the applications and the chaincode generate data linearly.

The estimated transaction numbers are also presented in the Table's [12](#page-125-0) rightmost column, excluding the first row, since it consists of a measure and not an estimate. Even though the Ethereum blockchain has a quite different concept, it serves as a good anchor for comparing data generation and transaction quantity. In the first half of 2021, the Ethereum main network grew approximately 1 [Gigabyte \(GB\)](#page-16-7) per day, with around 1.2 million transactions and the rate of 1 [GB](#page-16-7) per million transactions.

<span id="page-125-0"></span>

Table 12 – Data generation and transaction estimates based on the successful Phase 2 round

Meanwhile, our network generated data at the rate of 8 [GB](#page-16-7) per million transactions. Only a single endorser signed the transactions on our experiments. Therefore, this rate could increase proportionally to the endorsers' quantity in other scenarios. Solutions to deal with such characteristics would enhance the proposed model and increase its adoption chance.

We consider the idea of multi-layer chains (or channels) as a possible solution. The upper-level chains could perform some digest on the lower chains' transactions and store it. The raw data could last for a specific time interval and, after that, be digested, referenced in the upper chain, and erased from the lower chain.

In our experiments' context, the lower chain is equivalent to the network proposed and implemented by this work. The upper chain could be developed by future work. This architecture fits well with an energy trading scenario that does not require high granularity for long periods. As a result, the data generation rate could be lowered.

## 7.4 ENERGY NETWORK BASELINE COST ANALYSIS

Evaluating the costs of a proposal is crucial for judging its feasibility. For that reason, we estimate the cost to deploy our model. Based on the c6g.8xlarge [AWS](#page-16-3) instances costs, we estimate the funds needed to run a network equivalent to the 4<sup>th</sup> round of Phase 3 in terms of execution cost. Nevertheless, since we focused our data generation analysis on the Phase 2 round, it will serve as a reference to estimate the storage costs.

The c6g.8xlarge instance on-demand costs 0.6816 [USD](#page-17-0) hourly. Regarding storage, we consider the pricing for an [AWS](#page-16-3) General Purpose [Solid-State Drive \(SSD\)](#page-17-1) (gp2) [Elastic Block Store \(EBS\),](#page-16-8) which is 0.114 [USD](#page-17-0) per [GB-](#page-16-7)Month. All costs are related to the Mumbai region and displayed in Table [13.](#page-126-0) In the first three rows, we assumed that the storage space was **fully** provisioned at the beginning. However, we considered that the storage increases on a month-by-month demand basis for the year cost row. Equation [2](#page-126-1) expresses the formula to calculate it as a 12 term sum of the monthly cost arithmetic progression.

<span id="page-126-0"></span>Execution period single instance cost [\(USD\)](#page-17-0) Orderer/Peer total cost ([USD\)](#page-17-0) Instances generated data [USD](#page-17-0) EBS cost for Total cost ([USD\)](#page-17-0) Transactions 27 minutes 0.3 0.6 0.114 0.714 150 K 1 day 16.35 32.70 7.24 39.94 8 M 1 month 490.5 981 205.2 1186.2 240 M 1 year 5886 11772 16005 27777 2.8 B

<span id="page-126-1"></span>
$$
Ysc = \frac{(GBMc * Yg * 12 + GBMc * Yg) * 12}{2}
$$
 (2)

Table 13 – Cost estimate based on round 4 of Phase 3 execution, but Phase 2 data generation and transaction rate

Based on the yearly total cost and transaction rates, our model with one peer and one orderer has a cost [\(USD\)](#page-17-0) per transaction ratio of  $9.92 * 10^{-6}$ . Considering an average Ethereum transaction fee of 5 [USD](#page-17-0) while disregarding the 2021 transaction fee volatility [\(YCHARTS,](#page-140-0) [2021\)](#page-140-0), our network presents significantly lower costs. Even if compared against Ethereum's lowest historical transaction fee of 0.5 [USD,](#page-17-0) the comparison holds.

Unlike our experiments, a real Hyperledger Fabric network would have more than one peer and one orderer. Presuming that the real network would have 20 peers and 20 orderers to process the same 2.8 B, the cost per transaction would be around the value of  $1.94 * 10^{-4}$ , which still surpasses Ethereum (this is a rough estimate without considering that the transaction size and performance would be affected with more peers and orderers).

If the solution mentioned in Section [7.3](#page-122-1) about reducing the data generation rate is implemented, the costs could drop. Furthermore, other storage solutions like [AWS](#page-16-3) S3 or EFS should be analyzed in our model's context. The [EBS](#page-16-8) has a maximum capacity of 16 [Tebibyte \(TiB\)](#page-17-2) per volume, and changing the storage tools would change network prices.

#### 7.5 ENERGY NETWORK VIABILITY

We achieved a successful throughput of 5000 sellers, 5000 sensors, and 5000 buyers simultaneously. At these metrics, our proposed model suits a **small neighborhood**. The proportion between sensors and buyers/sellers in our experiments may differ in a real environment since much more buyers/sellers are expected than sensors.

The energy validation transactions consume a considerable amount of chaincode processing. For that reason, blockchain trading models without energy validation based on sensors' data might attain greater performance. However, this decision depends on the network architect's objectives of applying blockchain in the energy context.

We assumed that validating energy before the sale would prevent frauds and increase the trust in the energy generation type, serving as a useful feature. Buyers anonymization might be a regulators requirement to protect users according to data privacy laws, and our implementation covers it.

Our analysis' intent consists in providing **computational** and **cost** perspectives of blockchain use in energy trading. Energy engineering researchers might consider our findings and judge if blockchain fits this area due to their greater knowledge in the field.

### 7.6 RELATED WORK COMPARISON

The related work's proposals are heterogeneous, with different market designs, experiment complexity, and focus. However, this work contributed to the research done by their authors in many diverse aspects like privacy, scalability, experiment depth, experiment procedure, and empirical data. We compare our work's implementation and results with the related work based on their proposals, experiments, and

future directions.

The authors of [\(PEE et al.,](#page-138-0) [2019\)](#page-138-0), [\(HUSSAIN et al.,](#page-136-0) [2019\)](#page-136-0), [\(KODALI et al.,](#page-137-1) [2018\)](#page-137-1) only proposed or implemented simple models regarding blockchain in energy markets, and we brought clarity to a topic that lacks experimental data. As suggested by [\(HUSSAIN et al.,](#page-136-0) [2019\)](#page-136-0), our work did not use [PoW](#page-16-9) consensus. Even though our model was implemented with a single chain, different from [\(LU et al.,](#page-137-2) [2019\)](#page-137-2) and [\(PEE et al.,](#page-138-0) [2019\)](#page-138-0), we consider a multi-chain approach for dealing with the data quantity due to our model's data generation rate.

We implemented a solution with pseudonymity, as suggested by [\(AHL et al.,](#page-133-0) [2020\)](#page-133-0) future directions, and with off-chain payment to enable the pseudonymity, guaranteeing the funds, as mentioned by [\(LU et al.,](#page-137-2) [2019\)](#page-137-2). We did not implement dayahead and real-time market similar to [\(WANG, S. et al.,](#page-139-1) [2019\)](#page-139-1) because we focused on validating the energy before exchanging.

The most interesting comparison is with the thesis of [\(BLOM,](#page-134-0) [2018\)](#page-134-0). They implemented an energy market with an Ethereum smart contract using [PoW](#page-16-9) consensus, which consumes more power than the alternatives and should be avoided in a clean energy context. Furthermore, the authors implemented a model with off-chain market clearing. With these characteristics, they simulated their implementation with 600 entities transacting simultaneously.

Our implementation keeps the market clearing in the chain and adds the energy validation process based on sensors' data. Despite these smart contract processing increases, we could handle 15000 entities transacting simultaneously. Unlike [\(BLOM,](#page-134-0) [2018\)](#page-134-0) - with day-ahead, real-time, and load curtailment markets - our model only lets energy generated in the past be exchanged. Therefore, our exchange options implied a lower chaincode complexity in this aspect, perhaps helping with the higher throughput.

In terms of cost, the [\(BLOM,](#page-134-0) [2018\)](#page-134-0) required 8 billion Ethereum gas for a network with 600 entities and a 15-minute market clearing. Considering a gas price of 15.8 Gwei and an Ether price of 2031 [USD,](#page-17-0) their proposal would cost around 250 000 [USD](#page-17-0) per day if it ran in the Ethereum main net. Meanwhile, if the yearly costs of our experiment are divided by the days in a year, our model costs can be estimated to 76 [USD](#page-17-0) per day for each pair of peers and orderers.

Accomplishing the [\(BLOM,](#page-134-0) [2018\)](#page-134-0) future directions, our model could achieve higher scalability and better privacy. It was tested with real computers, even though we did not use real smart meters. The data in Table [13](#page-126-0) points to the best throughput of 93 transactions per second by our implementation. [\(DORRI et al.,](#page-135-0) [2019\)](#page-135-0) had a throughput of 6 transactions per minute, while [\(BLOM,](#page-134-0) [2018\)](#page-134-0) mentions the need for 52 transactions per second throughput, both in an Ethereum energy trading scenario.

While [\(HUANG et al.,](#page-136-1) [2019\)](#page-136-1) focused on the [IoT](#page-16-10) part of blockchain energy trad-

ing, we did not take our model and experiments that far. Future work could research lighter interactions between restricted [IoT](#page-16-10) devices and blockchain networks. The Hyperledger communication stack, including the Fabric [SDKs,](#page-16-11) seems too heavy for lightweight devices.

#### **8 CONCLUSION**

## 8.1 CONCLUSION AND CONTRIBUTIONS

In this work, we proposed, implemented, and analyzed a blockchain-based energy trading scheme with validation using [IoT](#page-16-10) sensors data. The negotiated energy must have been generated in the past and has a significant guarantee of origin. This is accomplished by a decentralized multi-organizational chaincode which requires a minimum organizations quorum to validate energy generation claims.

In our implementation, to protect buyers' energy consumption patterns, they transact with the network through a [k-TAA](#page-16-12) algorithm (idemix). Even though the energy cannot be bought on-demand in our model, the buyer anonymization facilitates the implementation of a future secure real-time blockchain energy market.

We analyzed our solution's performance, scalability, and costs, considering different quantities of sensors, buyers, sellers, and different hardware configurations for peers and orderers. Some Hyperledger configurations like the peer concurrency limit, the memory allocated for the chaincode, block size, and block interval also were changed and analyzed. Considering our results, our solution fits a small neighborhood context.

Hyperledger Fabric is more efficient computationally and monetarily than the Ethereum solutions presented by the related work, based on our solution's better throughput and estimated cost. With a single peer and a single orderer, we measured a cost per transaction outstandingly lower than the one charged by the Ethereum main net.

As secondary contributions, we developed scripts that easily deploy configurable Hyperledger networks, enabling that parameters like organizations, peer quantity, orderer quantity, chaincodes are easily defined. The certificates host fields are set according to the hosts attributed by the cloud service. These scripts contribute to future work that depends on deploying a Hyperledger network on a cloud infrastructure similar to [AWS.](#page-16-3)

Our Fabric modifications contribute to previous and future research. We enabled idemix in the fabric-gateway-java by implementing the required interfaces and performing small alterations on the fabric-sdk-java. The transactions, with our modifications, have priorities that are set by the chaincode function return.

It is now possible to bypass the *phantom read* checks by setting the proper chaincode function return method. Future work with Hyperledger chaincodes might take advantage of this modification to avoid that time-costly transactions are wrongfully invalidated due to the *phantom read conflicts*. Thus, the support for more complex chaincodes is increased.

At last, we analyzed the impact of the Hyperledger Fabric database type choice.

With our chaincode, Go LevelDB presented a significantly better performance than CouchDB. While CouchDB supports enhanced queries, it is quicker to retrieve data and implement the sorting in the chaincode using LevelDB. However, the more limited key queries with LevelDB require the proper design of data keys, or it might not be easy to perform attribute-based queries.

#### 8.2 FUTURE WORK

Since knowing the precise function to calculate the maximum possible energy generated by a specific solar panel type, or wind turbine, was out of our scope, we leave it as future work for researchers in electrical engineering. The network consensus on how much a specific solar panel model can generate given environment metrics could also be designed and implemented.

Hyperledger Fabric allows the change on multiple configuration parameters, and we did not explore the full extent of them. Further analysis on enhancing performance through better Fabric configuration would add more reliability to our work. Also, there is space for experiments with more organizations, peers, orderers, sensors, buyers, which might require model modifications to handle higher transaction throughput.

In our experiments, the utility and payment companies' [HTTP](#page-16-13) servers were removed to increase the reliability of the blockchain performance metrics. To fully validate our solution, new experiments, including the [HTTP](#page-16-13) servers, would be required. However, some challenges come with bringing them back.

Golang [HTTP](#page-16-13) servers would fit much better in terms of scalability and concurrent requests handling. Still, at the moment, only fabric-java-sdk provides idemix support, and the utility company server performs idemix signature verifications. Idemix support for the fabric-sdk-go would facilitate setting scalable [HTTP](#page-16-13) servers.

All sensors are retrieved from the database as possible participants of an energy validation claim process in our implementation. Then the chaincode calculates the sensor distance to the seller and judges if the sensor will participate or not. Instead, a geospatial database could take the seller's location as query input and only return the near sensors more efficiently, as we suppose.

The SmartData provides the confidence and error fields, but we do not evaluate them in our chaincode. Future work could consider these fields and give more weight to SmartData with bigger confidence and discard the SmartData with error. Such verification would increase the energy validation reliability.

Furthermore, SmartData version 1.2 supports data from moving sensors. At the current implementation, our chaincode considers all sensors as static data sources. However, extending it to moving ones could enhance the energy validation process, but it also would require more analysis.

The energy sold through our chaincode has to be generated in the past. Yet, the following work could use our current work as a base to experiment with a futures energy market with energy delivery verification. This would bring blockchains closer to the current energy markets, as discussed in Section [2.1.2.](#page-27-0)

In our previous work [\(WESTPHALL et al.,](#page-139-2) [2020\)](#page-139-2), we analyzed [Constrained Ap](#page-16-14)[plication Protocol \(CoAP\)](#page-16-14) and [Datagram Transport Layer Security \(DTLS\)](#page-16-15) on an [IoT](#page-16-10) gateway, both using [User Datagram Protocol \(UDP\),](#page-17-3) which is considered more efficient for constrained devices. Meanwhile, Hyperledger Fabric communicates through [gRPC,](#page-16-1) which uses [Transmission Control Protocol \(TCP\).](#page-17-4) An examination on sensors gateways running [gRPC](#page-16-1) would be relevant. Perhaps, a solution considering [IoT-](#page-16-10)friendly protocols could enhance the interaction between gateways and blockchains.

In the chaincode, sellers, sensors, and companies are uniquely identified by the Base64 encoding of the certificate Distinguished Names, usually generate a string sized around 176 bytes. A smaller unique identification would promote more efficient stores in Fabric's database, considering that, as an example, every SmartData record stores the sensor's identification string.

We could not find any energy consumption per instance type in [AWS](#page-16-3) [EC2](#page-16-16) documentation. The energy spent on our models' execution would be an interesting metric to decide if our model is efficient from an energetic and environmental standpoint. The clean energy amount negotiated and incentivized by the blockchain market should be worth the energy spent on executing the market's infrastructure.

The authors of [\(GORENFLO et al.,](#page-136-2) [2019\)](#page-136-2) present some adaptations on Hyperledger Fabric source code that scale up its throughput to a rate of 20000 transactions per second. Since some of our chaincode's transactions require considerably more processing than regular Hyperledger Fabric transactions, future work could run our experiments with [\(GORENFLO et al.,](#page-136-2) [2019\)](#page-136-2) adaptations to verify if the throughput would increase.

## **REFERENCES**

ABIDIN, Aysajan; ALY, Abdelrahaman; CLEEMPUT, Sara; MUSTAFA, Mustafa A. **Secure and Privacy-Friendly Local Electricity Trading and Billing in Smart Grid**. [S.l.: s.n.], 2018. arXiv: [1801.08354 \[cs.CR\]](https://arxiv.org/abs/1801.08354).

<span id="page-133-0"></span>AHL, A.; YARIME, M.; GOTO, M.; CHOPRA, Shauhrat S.; KUMAR, Nallapaneni Manoj.; TANAKA, K.; SAGAWA, D. Exploring blockchain for the energy transition: Opportunities and challenges based on a case study in Japan. **Renewable and Sustainable Energy Reviews**, v. 117, p. 109488, 2020. ISSN 1364-0321. DOI: [https://doi.org/10.1016/j.rser.2019.109488](https://doi.org/https://doi.org/10.1016/j.rser.2019.109488). Available from: <http://www.sciencedirect.com/science/article/pii/S1364032119306963>.

ALABDULLATIF, Abdullah M.; GERDING, Enrico H.; PEREZ-DIAZ, Alvaro. Market Design and Trading Strategies for Community Energy Markets with Storage and Renewable Supply. **Energies**, v. 13, n. 4, 2020. ISSN 1996-1073. DOI: [10.3390/en13040972](https://doi.org/10.3390/en13040972). Available from: <https://www.mdpi.com/1996-1073/13/4/972>.

ALAM, A.; ISLAM, M. T.; FERDOUS, A. Towards Blockchain-based Electricity Trading System and Cyber Resilient Microgrids. In: 2019 International Conference on Electrical, Computer and Communication Engineering (ECCE). [S.l.: s.n.], 2019. P. 1–5.

ALAM, Asraful; FERDOUS, Arafa; ISLAM, Mohammad. Towards Blockchain-based Electricity Trading System and Cyber Resilient Microgrids. In: DOI: [10.1109/ECACE.2019.8679442](https://doi.org/10.1109/ECACE.2019.8679442).

ANDONI, Merlinda; ROBU, Valentin; FLYNN, David; ABRAM, Simone; GEACH, Dale; JENKINS, David; MCCALLUM, Peter; PEACOCK, Andrew. Blockchain technology in the energy sector: A systematic review of challenges and opportunities. **Renewable and Sustainable Energy Reviews**, v. 100, p. 143–174, 2019. ISSN 1364-0321. DOI: [https://doi.org/10.1016/j.rser.2018.10.014](https://doi.org/https://doi.org/10.1016/j.rser.2018.10.014). Available from: <http://www.sciencedirect.com/science/article/pii/S1364032118307184>.

ANDROULAKI, Elli et al. Hyperledger fabric. **Proceedings of the Thirteenth EuroSys Conference**, ACM, Apr. 2018. DOI: [10.1145/3190508.3190538](https://doi.org/10.1145/3190508.3190538). Available from: <http://dx.doi.org/10.1145/3190508.3190538>.

AU, Man Ho; SUSILO, Willy; MU, Yi. Constant-Size Dynamic k-TAA. In: DE PRISCO, Roberto; YUNG, Moti (Eds.). **Security and Cryptography for Networks**. Berlin, Heidelberg: Springer Berlin Heidelberg, 2006. P. 111–125.

AUTHORS, Amazon. **User Guide for Linux Instances**. [S.l.: s.n.], 2021. Online; accessed April, 2021. Available from: <https://docs.aws.amazon.com/AWSEC2/latest/UserGuide/concepts.html>.

AVANCINI, Danielly B.; RODRIGUES, Joel J.P.C.; MARTINS, Simion G.B.; RABÊLO, Ricardo A.L.; AL-MUHTADI, Jalal; SOLIC, Petar. Energy meters evolution in smart grids: A review. **Journal of Cleaner Production**, v. 217, p. 702–715, 2019. ISSN 0959-6526. DOI: [https://doi.org/10.1016/j.jclepro.2019.01.229](https://doi.org/https://doi.org/10.1016/j.jclepro.2019.01.229). Available from:

<http://www.sciencedirect.com/science/article/pii/S0959652619302501>.

BEN-KIKI, O.; EVANS, C; DÖT NET, I. **YAML: YAML Ain't Markup Language**. [S.l.: s.n.], 2020. Online; accessed December, 2020. Available from: <https://yaml.org/>.

BERNAL BERNABE, J.; CANOVAS, J. L.; HERNANDEZ-RAMOS, J. L.; TORRES MORENO, R.; SKARMETA, A. Privacy-Preserving Solutions for Blockchain: Review and Challenges. **IEEE Access**, v. 7, p. 164908–164940, 2019.

<span id="page-134-0"></span>BLOM, Frederik. **A Feasibility Study of Blockchain Technology As Local Energy Market Infrastructure**. 2018. Available from: <https://ntnuopen.ntnu.no/ntnu-xmlui/handle/11250/2502356>.

BLUMMER, Tamas et al. **An Introduction to Hyperledger**. [S.l.: s.n.], 2018. Online; accessed May, 2020. Available from: [https://www.hyperledger.org/wp](https://www.hyperledger.org/wp-content/uploads/2018/08/HL_Whitepaper_IntroductiontoHyperledger.pdf)[content/uploads/2018/08/HL\\_Whitepaper\\_IntroductiontoHyperledger.pdf](https://www.hyperledger.org/wp-content/uploads/2018/08/HL_Whitepaper_IntroductiontoHyperledger.pdf).

CALDARELLI, Giulio. Real-world blockchain applications under the lens of the oracle problem. A systematic literature review. In: 2020 IEEE International Conference on Technology Management, Operations and Decisions (ICTMOD). [S.l.: s.n.], 2020. P. 1–6. DOI: [10.1109/ICTMOD49425.2020.9380598](https://doi.org/10.1109/ICTMOD49425.2020.9380598).

CAMENISCH, Jan; LYSYANSKAYA, Anna. Signature Schemes and Anonymous Credentials from Bilinear Maps. In: FRANKLIN, Matt (Ed.). **Advances in Cryptology – CRYPTO 2004**. Berlin, Heidelberg: Springer Berlin Heidelberg, 2004. P. 56–72.

CAO, Ling; WAN, Zheyi. Anonymous scheme for blockchain atomic swap based on zero-knowledge proof. In: 2020 IEEE International Conference on Artificial Intelligence and Computer Applications (ICAICA). [S.l.: s.n.], 2020. P. 371–374. DOI: [10.1109/ICAICA50127.2020.9181875](https://doi.org/10.1109/ICAICA50127.2020.9181875).

COMMITTEE, Microprocessor Standards. IEEE Standard for Floating-Point Arithmetic. **IEEE Std 754-2019 (Revision of IEEE 754-2008)**, p. 1–84, 2019. DOI: [10.1109/IEEESTD.2019.8766229](https://doi.org/10.1109/IEEESTD.2019.8766229).

LE-DANG, Q.; LE-NGOC, T. Scalable Blockchain-based Architecture for Massive IoT Reconfiguration. In: 2019 IEEE Canadian Conference of Electrical and Computer Engineering (CCECE). [S.l.: s.n.], 2019. P. 1–4.

DATA, The Secret Lives of. **Raft Understandable Distributed Consensus**. [S.l.: s.n.], 2020. Online; accessed October, 2020. Available from: <http://thesecretlivesofdata.com/raft/>.

<span id="page-135-0"></span>DORRI, A.; HILL, A.; KANHERE, S.; JURDAK, R.; LUO, F.; DONG, Z. Y. Peer-to-Peer EnergyTrade: A Distributed Private Energy Trading Platform. In: 2019 IEEE International Conference on Blockchain and Cryptocurrency (ICBC). [S.l.: s.n.], 2019. P. 61–64.

ENERGY, Leaders in. **Utilities of the future**. [S.l.: s.n.]. Online; accessed May, 2020. Available from:

[https://leadersinenergy.org/wp-content/uploads/2018/10/Caldwell-2018-](https://leadersinenergy.org/wp-content/uploads/2018/10/Caldwell-2018-Utilities-of-the-Future-Slide-Deck_FINAL-FOR-DISTRIBUTION.pdf) [Utilities-of-the-Future-Slide-Deck\\_FINAL-FOR-DISTRIBUTION.pdf](https://leadersinenergy.org/wp-content/uploads/2018/10/Caldwell-2018-Utilities-of-the-Future-Slide-Deck_FINAL-FOR-DISTRIBUTION.pdf).

FOSCHINI, L.; GAVAGNA, A.; MARTUSCELLI, G.; MONTANARI, R. Hyperledger Fabric Blockchain: Chaincode Performance Analysis. In: ICC 2020 - 2020 IEEE International Conference on Communications (ICC). [S.l.: s.n.], 2020. P. 1–6. DOI: [10.1109/ICC40277.2020.9149080](https://doi.org/10.1109/ICC40277.2020.9149080).

FRANCIA, Steve. **Viper github**. [S.l.: s.n.], 2020. Online; accessed December, 2020. Available from: <https://github.com/spf13/viper>.

GOEL, Seep; SINGH, Abhishek; GARG, Rachit; VERMA, Mudit; JAYACHANDRAN, Praveen. Resource Fairness and Prioritization of Transactions in Permissioned Blockchain Systems (Industry Track). In: (Middleware '18), p. 46–53. DOI: [10.1145/3284028.3284035](https://doi.org/10.1145/3284028.3284035). Available from: <https://doi.org/10.1145/3284028.3284035>.

<span id="page-136-2"></span>GORENFLO, Christian; LEE, Stephen; GOLAB, Lukasz; KESHAV, S. **FastFabric: Scaling Hyperledger Fabric to 20,000 Transactions per Second**. [S.l.: s.n.], 2019. arXiv: [1901.00910 \[cs.DC\]](https://arxiv.org/abs/1901.00910).

<span id="page-136-1"></span>HUANG, Z.; SUANKAEWMANEE, K.; KANG, J.; NIYATO, D.; SIN, N. P. Development of Reliable Wireless Communication System for Secure Blockchain-based Energy Trading. In: 2019 16th International Joint Conference on Computer Science and Software Engineering (JCSSE). [S.l.: s.n.], 2019. P. 126–130.

<span id="page-136-0"></span>HUSSAIN, S. M. S.; FAROOQ, S. M.; USTUN, T. S. Implementation of Blockchain technology for Energy Trading with Smart Meters. In: 2019 Innovations in Power and Advanced Computing Technologies (i-PACT). [S.l.: s.n.], 2019. P. 1–5.

INC., Docker. **Welcome to Docker Hub**. [S.l.: s.n.], 2020. Online; accessed December, 2020. Available from: <https://hub.docker.com/>.

JEON, J. M.; HONG, C. S. A Study on Utilization of Hybrid Blockchain for Energy Sharing in Micro-Grid. In: 2019 20th Asia-Pacific Network Operations and Management Symposium (APNOMS). [S.l.: s.n.], 2019. P. 1–4.

JOGUNOLA, O.; HAMMOUDEH, M.; ADEBISI, B.; ANOH, K. Demonstrating Blockchain-Enabled Peer-to-Peer Energy Trading and Sharing. In: 2019 IEEE Canadian Conference of Electrical and Computer Engineering (CCECE). [S.l.: s.n.], 2019. P. 1–4.

JOHANNING, S.; BRUCKNER, T. Blockchain-based Peer-to-Peer Energy Trade: A Critical Review of Disruptive Potential. In: 2019 16th International Conference on the European Energy Market (EEM). [S.l.: s.n.], 2019. P. 1–8.

KAMAL, M.; TARIQ, M. Light-Weight Security and Blockchain Based Provenance for Advanced Metering Infrastructure. **IEEE Access**, v. 7, p. 87345–87356, 2019.

KANG, E. S.; PEE, S. J.; SONG, J. G.; JANG, J. W. A Blockchain-Based Energy Trading Platform for Smart Homes in a Microgrid. In: 2018 3rd International Conference on Computer and Communication Systems (ICCCS). [S.l.: s.n.], 2018. P. 472–476.

KAUR, Amanpreet; NONNENMACHER, Lukas; PEDRO, Hugo T.C.; COIMBRA, Carlos F.M. Benefits of solar forecasting for energy imbalance markets. **Renewable Energy**, v. 86, p. 819–830, 2016. ISSN 0960-1481. DOI:

[https://doi.org/10.1016/j.renene.2015.09.011](https://doi.org/https://doi.org/10.1016/j.renene.2015.09.011). Available from: <http://www.sciencedirect.com/science/article/pii/S0960148115302901>.

<span id="page-137-1"></span>KODALI, R. K.; YERROJU, S.; YOGI, B. Y. K. Blockchain Based Energy Trading. In: TENCON 2018 - 2018 IEEE Region 10 Conference. [S.l.: s.n.], 2018. P. 1778–1783.

LISHA. **EPOS 2 User Guide**. [S.l.: s.n.], 2020a. Online; accessed February, 2021. Available from: <https://epos.lisha.ufsc.br/IoT+Platform#SmartData>.

LISHA. **EPOS 2 User Guide**. [S.l.: s.n.], 2020b. Online; accessed February, 2021. Available from: <https://epos.lisha.ufsc.br/EPOS+2+User+Guide#SmartData>.

<span id="page-137-2"></span>LU, X.; GUAN, Z.; ZHOU, X.; DU, X.; WU, L.; GUIZANI, M. A Secure and Efficient Renewable Energy Trading Scheme Based on Blockchain in Smart Grid. In: 2019 IEEE 21st International Conference on High Performance Computing and Communications; IEEE 17th International Conference on Smart City; IEEE 5th International Conference on Data Science and Systems (HPCC/SmartCity/DSS). [S.l.: s.n.], 2019. P. 1839–1844.

MEDEIROS FRÖHLICH, A. A. SmartData: an IoT-ready API for sensor networks. **International Journal of Sensor Networks (IJSNET)**, v. 28, p. 202–210, 2018. ISSN 0959-6526. DOI: [https://doi.org/10.1504/IJSNET.2018.096264](https://doi.org/https://doi.org/10.1504/IJSNET.2018.096264). Available from:

<https://www.inderscienceonline.com/doi/abs/10.1504/IJSNET.2018.096264>.

MENGELKAMP, Esther; GÄRTTNER, Johannes; ROCK, Kerstin; KESSLER, Scott; ORSINI, Lawrence; WEINHARDT, Christof. Designing microgrid energy markets: A case study: The Brooklyn Microgrid. **Applied Energy**, v. 210, p. 870–880, 2018. ISSN 0306-2619. DOI: [https://doi.org/10.1016/j.apenergy.2017.06.054](https://doi.org/https://doi.org/10.1016/j.apenergy.2017.06.054). Available from:

<http://www.sciencedirect.com/science/article/pii/S030626191730805X>.

<span id="page-137-0"></span>MOON, Sung Jun; PARK, In Hwan; LEE, Beom Suk; JU WOOK, Jang. A Hyperledger-based P2P Energy Trading Scheme using Cloud Computing with Low Capabillity Devices. In: 2019 IEEE International Conference on Smart Cloud (SmartCloud). [S.l.: s.n.], 2019. P. 190–192. DOI: [10.1109/SmartCloud.2019.00039](https://doi.org/10.1109/SmartCloud.2019.00039). ORSINI, L.; KEMENADE, C.; WEB, M.; HEITMANN, P. Transactive Energy, 2019. Unavailable; accessed May, 2020. Available from: [https://exergy.energy/wp](https://exergy.energy/wp-content/uploads/2019/03/TransactiveEnergy-PolicyPaper-v2-2.pdf)[content/uploads/2019/03/TransactiveEnergy-PolicyPaper-v2-2.pdf](https://exergy.energy/wp-content/uploads/2019/03/TransactiveEnergy-PolicyPaper-v2-2.pdf).

<span id="page-138-0"></span>PEE, S. J.; KANG, E. S.; SONG, J. G.; JANG, J. W. Blockchain based smart energy trading platform using smart contract. In: 2019 International Conference on Artificial Intelligence in Information and Communication (ICAIIC). [S.l.: s.n.], 2019. P. 322–325.

PINSON, Pierre. **Renewables in Electricity Markets**. [S.l.]: Technical University of Denmark, 2018. Online; accessed May, 2020. Available from: <http://pierrepinson.com/index.php/teaching/>.

PODGORELEC, B.; KERŠIČ, V.; TURKANOVIĆ, M. Analysis of Fault Tolerance in Permissioned Blockchain Networks. In: 2019 XXVII International Conference on Information, Communication and Automation Technologies (ICAT). [S.l.: s.n.], 2019. P. 1–6. DOI: [10.1109/ICAT47117.2019.8938836](https://doi.org/10.1109/ICAT47117.2019.8938836).

POOL, Nord. **See what Nord Pool can offer you**. [S.l.: s.n.], 2020. Online; accessed May, 2020. Available from: <https://www.nordpoolgroup.com/>.

PROJECT, Hyperledger. **Gossip data dissemination protocol**. [S.l.: s.n.], 2020. Online; accessed March, 2021. Available from: <https://hyperledger-fabric.readthedocs.io/en/release-2.3/gossip.html>.

RAHOUTI, M.; XIONG, K.; GHANI, N. Bitcoin Concepts, Threats, and Machine-Learning Security Solutions. **IEEE Access**, v. 6, p. 67189–67205, 2018.

TEAM, Fabric. **Client Identity Chaincode Library**. [S.l.: s.n.], 2021. Online; accessed February, 2021. Available from: [https:](https://github.com/hyperledger/fabric-chaincode-go/tree/master/pkg/cid) [//github.com/hyperledger/fabric-chaincode-go/tree/master/pkg/cid](https://github.com/hyperledger/fabric-chaincode-go/tree/master/pkg/cid).

TEAM, Fabric. **Hyperledger Fabric Gateway SDK for Java**. [S.l.: s.n.], 2020a. Online; accessed December, 2020. Available from: <https://github.com/hyperledger/fabric-gateway-java>.

TEAM, Fabric. **Hyperledger Fabric SDK for Java**. [S.l.: s.n.], 2020b. Online; accessed December, 2020. Available from: <https://github.com/hyperledger/fabric-sdk-java>.

TEAM, Fabric Doc. **A Blockchain Platform for the Enterprise**. [S.l.: s.n.], 2020a. Online; accessed September, 2020. Available from: <https://hyperledger-fabric.readthedocs.io/en/release-2.3/>.

<span id="page-139-0"></span>TEAM, Fabric Doc. **CouchDB as the State Database**. [S.l.: s.n.], 2020b. Online; accessed February, 2021. Available from: [https://hyperledger](https://hyperledger-fabric.readthedocs.io/en/latest/couchdb_as_state_database.html)[fabric.readthedocs.io/en/latest/couchdb\\_as\\_state\\_database.html](https://hyperledger-fabric.readthedocs.io/en/latest/couchdb_as_state_database.html).

TEAM, Fabric Doc. **Read-Write set semantics**. [S.l.: s.n.], 2020c. Online; accessed April, 2021. Available from: [https://hyperledger](https://hyperledger-fabric.readthedocs.io/en/release-2.3/readwrite.html)[fabric.readthedocs.io/en/release-2.3/readwrite.html](https://hyperledger-fabric.readthedocs.io/en/release-2.3/readwrite.html).

TEAM, Fabric Doc. **The Ordering Service**. [S.l.: s.n.], 2020d. Online; accessed September, 2020. Available from: [https://hyperledger](https://hyperledger-fabric.readthedocs.io/en/release-2.3/orderer/ordering_service.html)[fabric.readthedocs.io/en/release-2.3/orderer/ordering\\_service.html](https://hyperledger-fabric.readthedocs.io/en/release-2.3/orderer/ordering_service.html).

TRÓN, Viktor; JAMESON, Hydson. **Ethereum Homestead Documentation**. [S.l.: s.n.], 2020. Online; accessed May, 2020. Available from: <https://ethdocs.org/en/latest/>.

VUJIČIĆ, D.; JAGODIĆ, D.; RANĐIĆ, S. Blockchain technology, bitcoin, and Ethereum: A brief overview. In: 2018 17th International Symposium INFOTEH-JAHORINA (INFOTEH). [S.l.: s.n.], 2018. P. 1–6.

WANG, Naiyu; ZHOU, Xiao; LU, Xin; GUAN, Zhitao; WU, Longfei; DU, Xiaojiang; GUIZANI, Mohsen. When Energy Trading Meets Blockchain in Electrical Power System: The State of the Art. **Applied Sciences**, v. 9, p. 1561, Apr. 2019. DOI: [10.3390/app9081561](https://doi.org/10.3390/app9081561).

<span id="page-139-1"></span>WANG, S.; TAHA, A. F.; WANG, J.; KVATERNIK, K.; HAHN, A. Energy Crowdsourcing and Peer-to-Peer Energy Trading in Blockchain-Enabled Smart Grids. **IEEE Transactions on Systems, Man, and Cybernetics: Systems**, v. 49, n. 8, p. 1612–1623, 2019.

WESTPHALL, Johann. **Energy Network - Developed in Hyperledger Fabric**. [S.l.: s.n.], 2021. Online; accessed April, 2021. Available from: <https://github.com/johannww/EnergyNetwork>.

<span id="page-139-2"></span>WESTPHALL, Johann; LOFFI, Leandro; WESTPHALL, Carla Merkle; EVERSON MARTINA, Jean. CoAP + DTLS: A Comprehensive Overview of Cryptographic Performance on an IOT Scenario. In: 2020 IEEE Sensors Applications Symposium (SAS). [S.l.: s.n.], 2020. P. 1–6. DOI: [10.1109/SAS48726.2020.9220033](https://doi.org/10.1109/SAS48726.2020.9220033).

XU, X.; WANG, X.; LI, Z.; YU, H.; SUN, G.; MAHARJAN, S.; ZHANG, Y. Mitigating Conflicting Transactions in Hyperledger Fabric Permissioned Blockchain for Delay-sensitive IoT Applications. **IEEE Internet of Things Journal**, p. 1–1, 2021. DOI: [10.1109/JIOT.2021.3050244](https://doi.org/10.1109/JIOT.2021.3050244).

YAGA, Dylan; MELL, Peter; ROBY, Nik; SCARFONE, Karen. Blockchain technology overview. National Institute of Standards and Technology, Oct. 2018. DOI: [10.6028/nist.ir.8202](https://doi.org/10.6028/nist.ir.8202). Available from: <https://nvlpubs.nist.gov/nistpubs/ir/2018/NIST.IR.8202.pdf>.

<span id="page-140-0"></span>YCHARTS. **Ethereum Average Transaction Fee**. [S.l.: s.n.], 2021. Online; accessed July, 2021. Available from: [https://ycharts.com/indicators/ethereum\\_average\\_transaction\\_fee](https://ycharts.com/indicators/ethereum_average_transaction_fee).

ZIEGLER, M. H.; GROBMANN, M.; KRIEGER, U. R. Integration of Fog Computing and Blockchain Technology Using the Plasma Framework. In: 2019 IEEE International Conference on Blockchain and Cryptocurrency (ICBC). [S.l.: s.n.], 2019. P. 120–123.

#### **APPENDIX A – ENERGY VALIDATION CODE**

```
Code A.1 – Solar energy validation function based on Candela SmartData
 1 func getMaxPossibleGeneratedSolarEnergyInInterval(stub
      shim.ChaincodeStubInterface, nearTrustedSensorsSmartData
      *[]st.SmartData, solarPanelsNumber uint64) float64 {
 2 sensorSmartDataQuantity := make(map[string]int)
 3 sensorSmartDataSum := make(map[string]float64)
 4 sensorSmartDataMean := make(map[string]float64)
 5
 6 for _, smartData := range *nearTrustedSensorsSmartData {
 7 si := smartData.Unit >> 31
8 num := smartData.Unit >> 29 & 3
9 mod := smartData.Unit >> 27 & 3
10 if si == 1 && mod == 0 {
11 isCandelaUnit := (smartData.Unit & smartDataUnitMask) ==
            smartDataCandelaUnitPart
12 if isCandelaUnit {
13 sensorSmartDataQuantity[smartData.AssetID]++
14 if num < 2 {
15 //consider float64 bytes as int
16 sensorSmartDataSum[smartData.AssetID] +=
               float64(math.Float64bits(smartData.Value))
17 } else {
18 sensorSmartDataSum[smartData.AssetID] += smartData.Value
19 }
20 ...
21 }
22 for sensorID, sum := range sensorSmartDataSum {
23 sensorSmartDataMean[sensorID] = sum /
          float64(sensorSmartDataQuantity[sensorID])
24 }
25 luminosityMean := 0.0
26 nSensors := 0.0
27 for _, sensorLuminosityMean := range sensorSmartDataMean {
28 luminosityMean = (luminosityMean*nSensors + sensorLuminosityMean) /
          (nSensors + 1)
29 nSensors++
30 }
31 return luminosityMean * float64(solarPanelsNumber) * 10000000
32 }
```