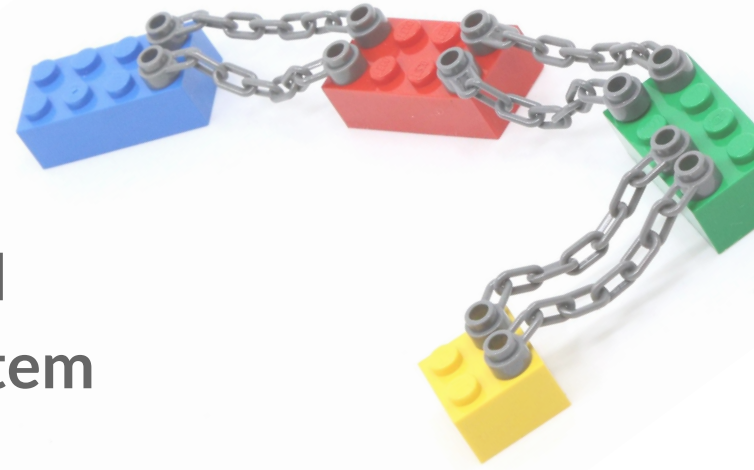


# A Blockchain based Recommendation System



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# Walkthrough

1. Context
2. Model
3. Prototype and Experimental evaluations
4. Conclusions





# Recommender and Rating systems

Platforms processing user input with the goal of suggesting new products and services

Typical user input data: the **Rating**  
Star score system, Like/Dislike, Like...



- ★★★★★ Excellent
- ★★★★☆ Above Average
- ★★★☆☆ Average
- ★★★☆☆ Below Average
- ★☆☆☆☆ Poor





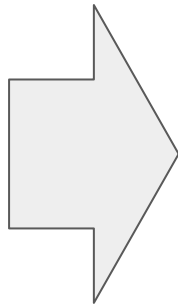
# Ratings



Assessing the storage of a Rating in the Blockchain

## Blockchain

- Transparency
- Immutability



## Rating

- Auditable, not censurable
- Is it possible to ask the removal of a Rating?





## Ratings

**Una recensione è  
per sempre: il  
ristorante non ha  
diritto all'oblio**



*Due decisioni del tribunale di Roma sanciscono che sulle piattaforme conta di più l'interesse dell'utente*

Fonte: La Repubblica (27/02/19):

[https://www.repubblica.it/cronaca/2019/02/27/news/recensione\\_ristoranti\\_diritto\\_oblio-220220155/](https://www.repubblica.it/cronaca/2019/02/27/news/recensione_ristoranti_diritto_oblio-220220155/)



# Proposal

A framework for the **record-keeping** of user ratings on a blockchain platform

Provide a **model** for the definition of a transparent and traceable functionality for the storage control and the processing of user ratings

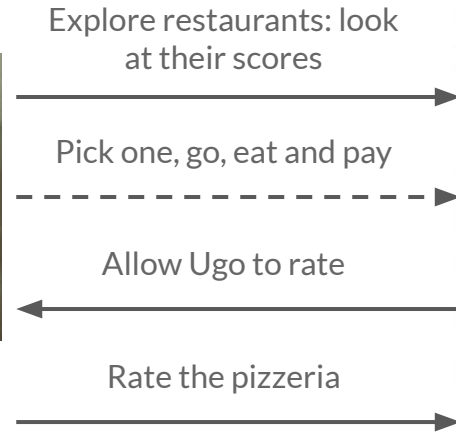




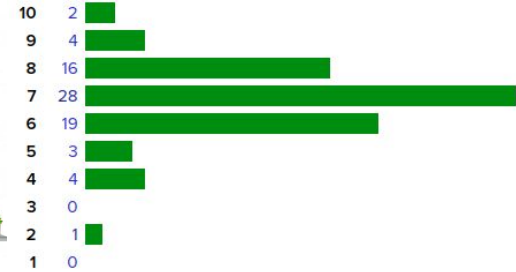
# Workflow



Ugo



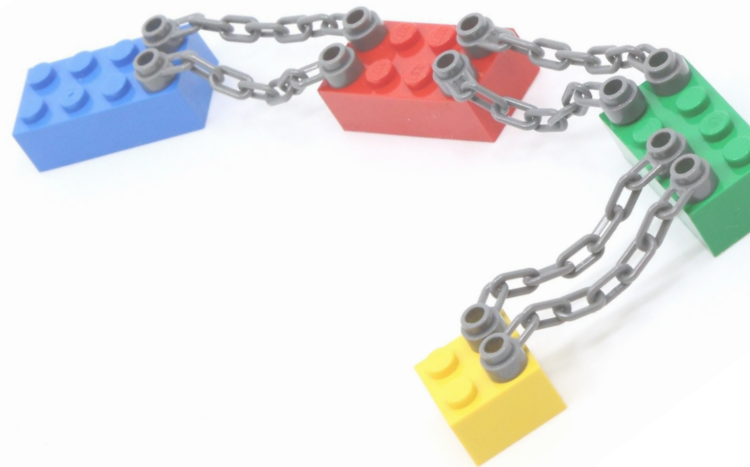
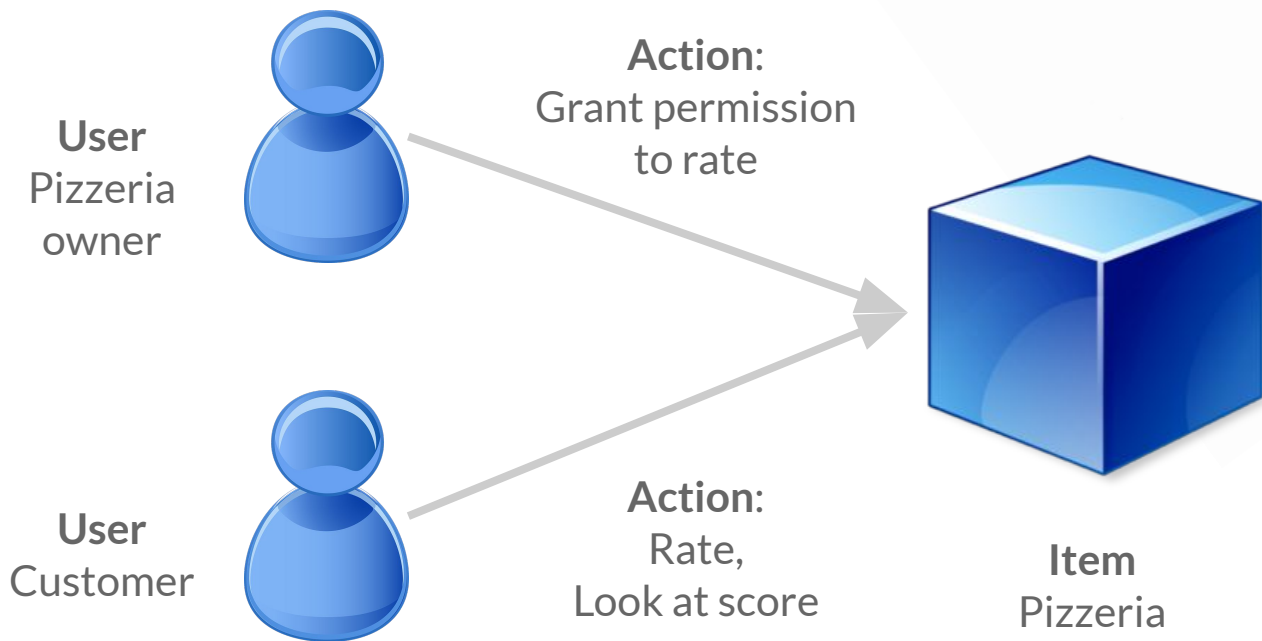
Pizzeria



Ratings



# Model

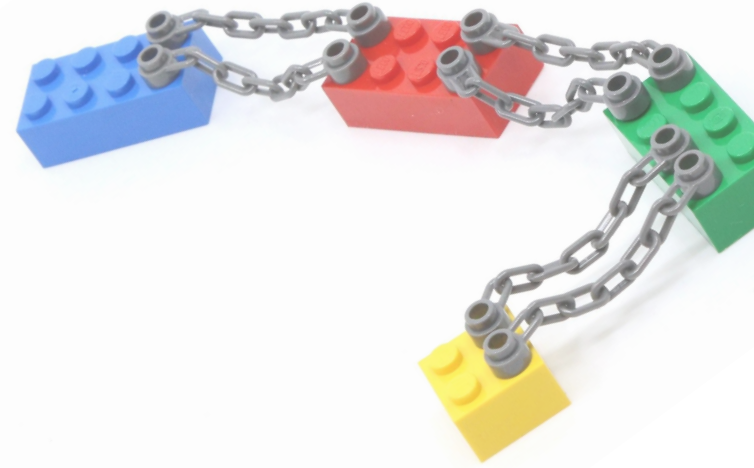
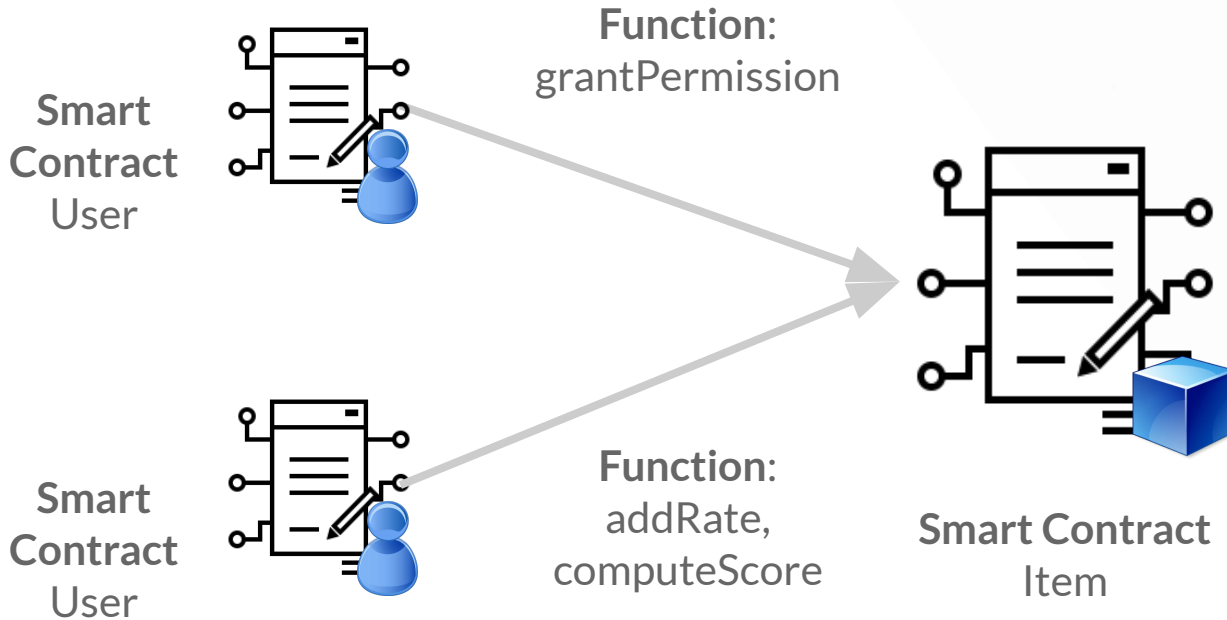


**Terminology:**  
Recommender Systems:  
Introduction and Challenges  
F. Ricci, L. Rokach, B. Shapira



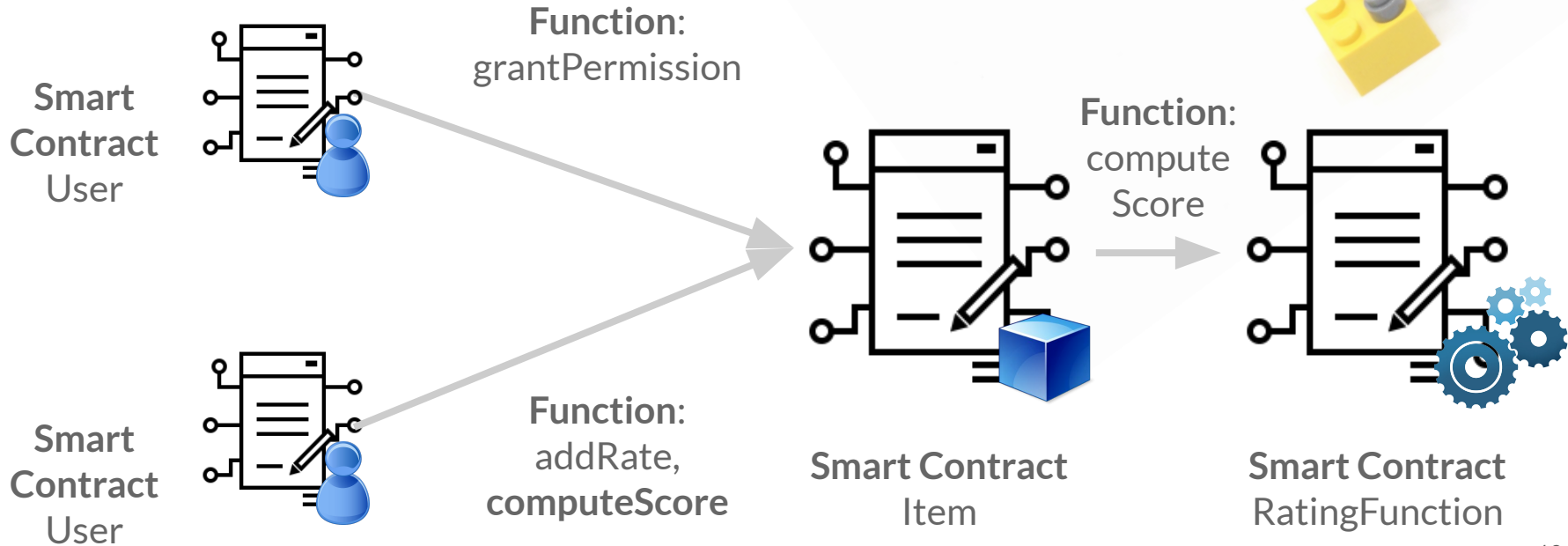


# Model





# Model

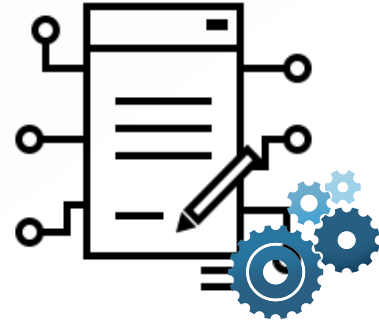




## Rating Functions

A **Rating Function** is a smart contract with the sole purpose of computing the score of an Item

As a smart contract, a Rating Function is public and immutable



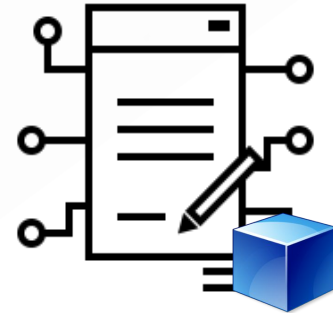
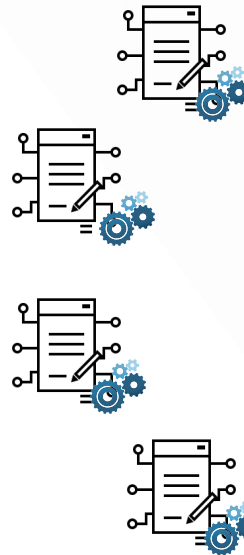
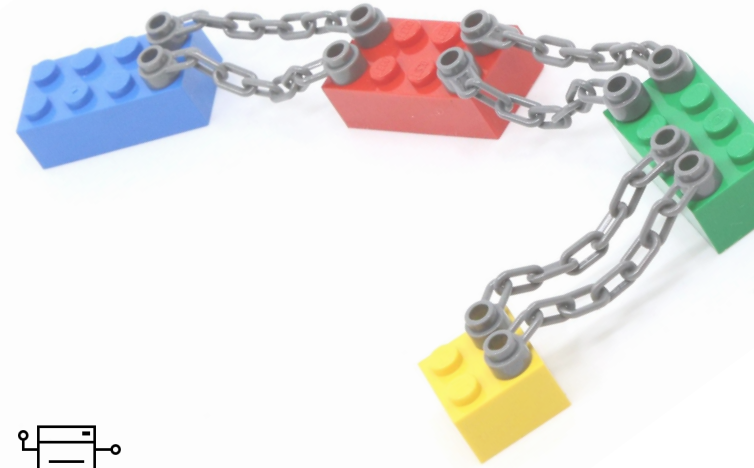


# Rating Functions

Each Rating Function implements a single evaluation formula

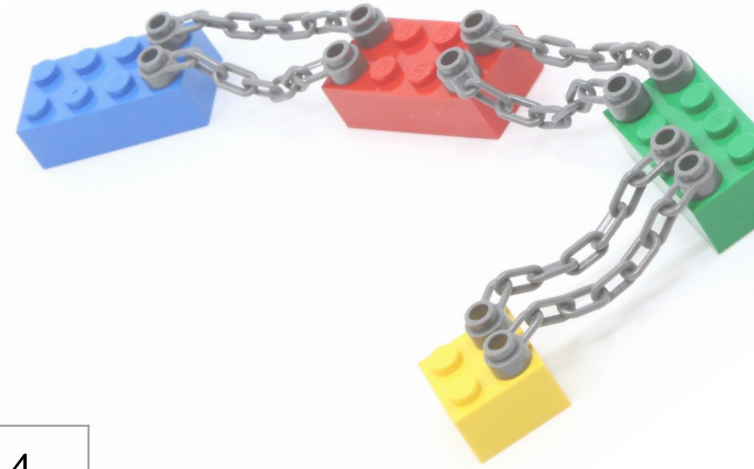
- But all share the same input model

In this way users evaluate the score of Items according to different evaluation criteria



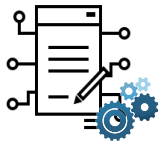


# Rating Functions - Example



## Input

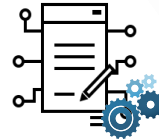
Score	9	8	9	6	7	5	4
Timetamp	5	8	10	20	22	25	30



F1



F2



F3

Output





# Ethereum prototype

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A simplified prototype running on top of **Ethereum**

Smart Contracts implemented in **Solidity**

Limitation inherited from Ethereum: **the Gas**





## Evaluation: Rating Functions

Due to the **gas** and **Solidity constraints**, a Rating Function cannot implement complex formulas

We evaluate two functions: **Simple Average** and **Weighted Average**, with input composed by:

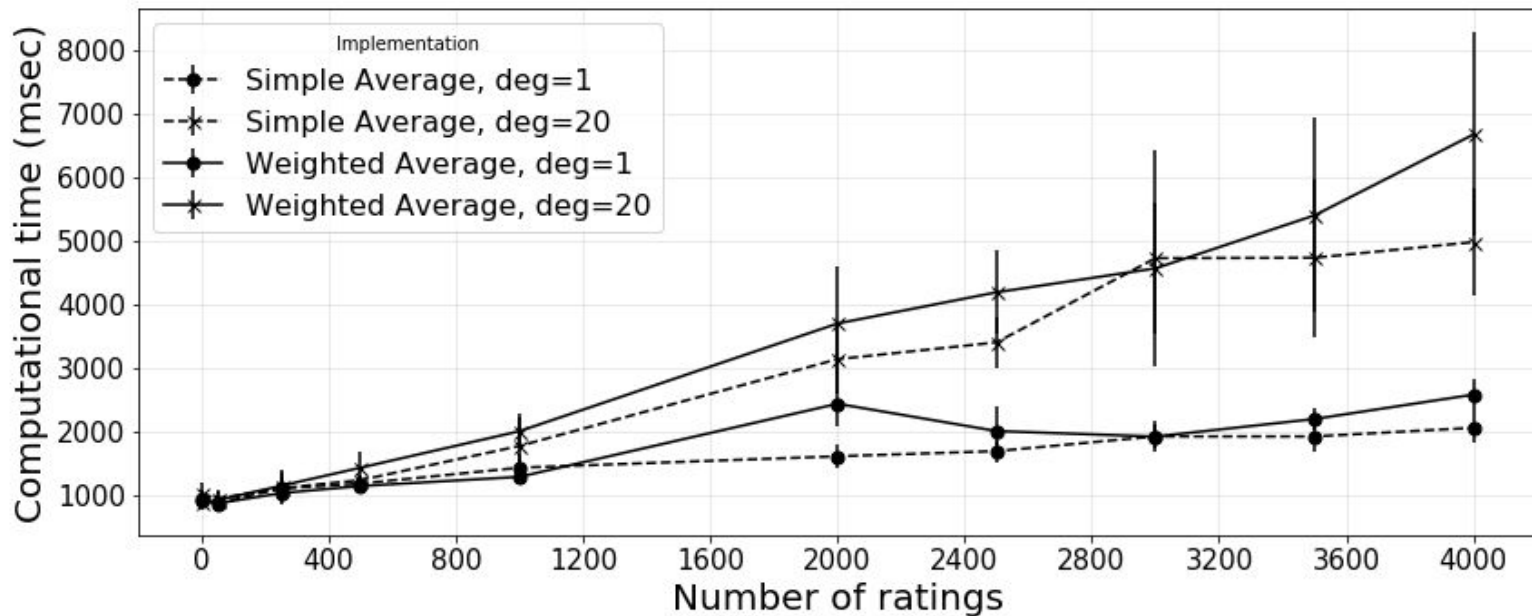
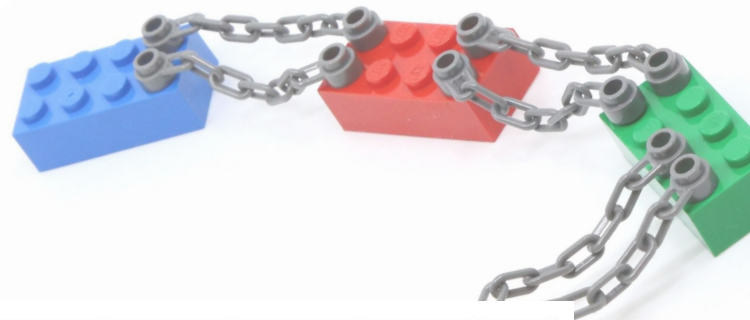
- A score list
- The block index list

Network: Ropsten Testnet





# Evaluation: Rating Functions



Gas Limit: 4,7M



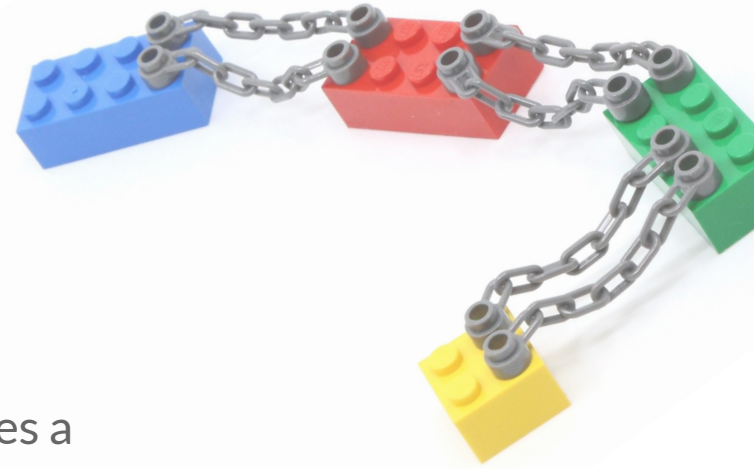


## Evaluation: Transactions

It is a common knowledge Ethereum 1.0 processes a limited number of transactions per second

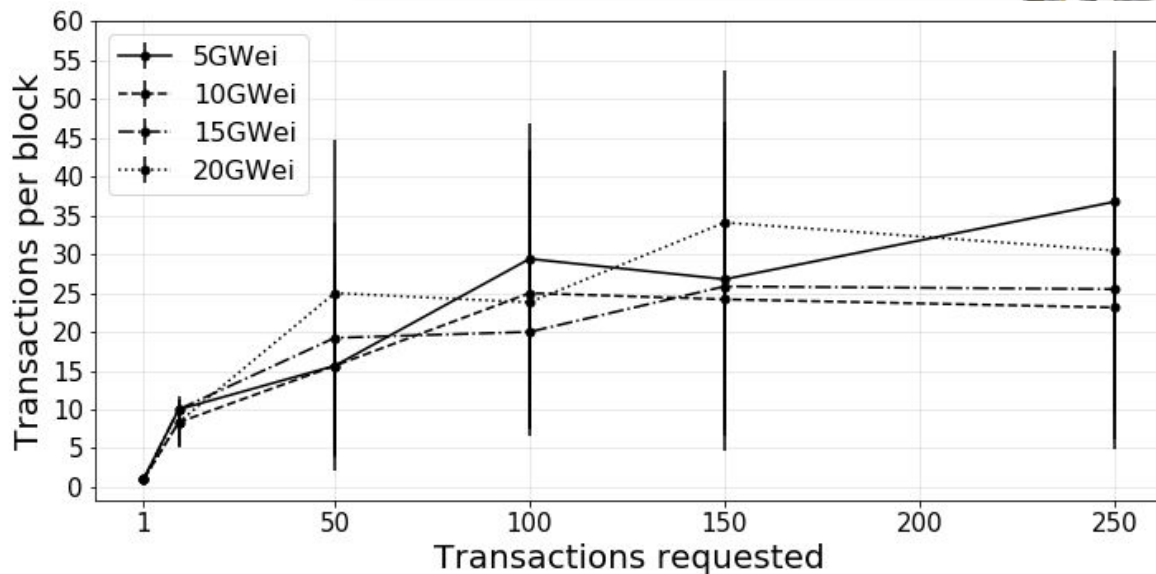
A write-function is embedded in a transaction, thus it is subjected to mining limitations

Currently, a block contains up to 8M units of gas





# Transactions: grantPermission

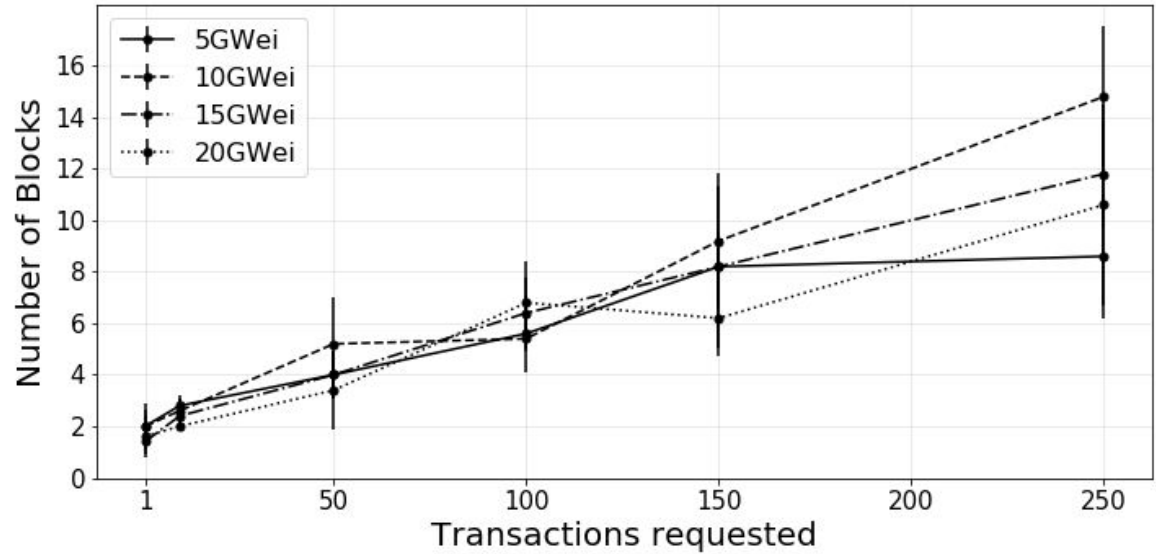
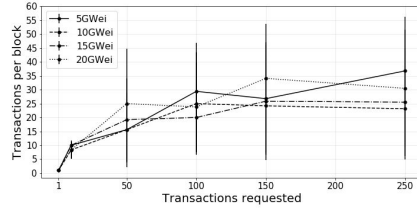


Transactions per block

Gas cost: 78,735



# Transactions: grantPermission

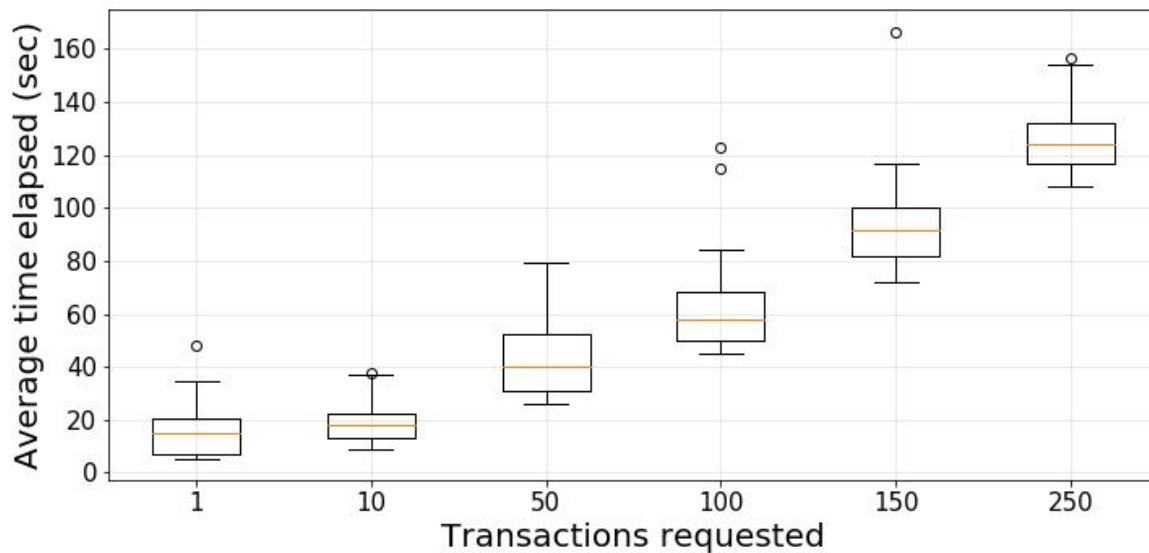
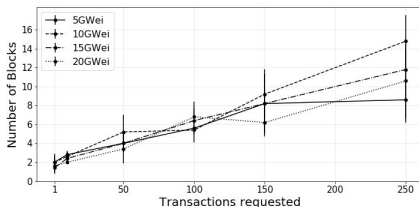
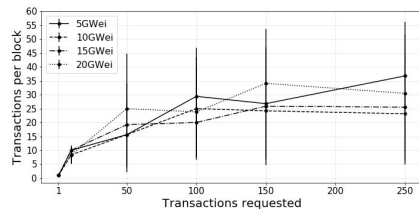


Elapsed time: number of Blocks

Gas cost: 78,735



# Transactions: grantPermission



Elapsed time: seconds

Gas cost: 78,735

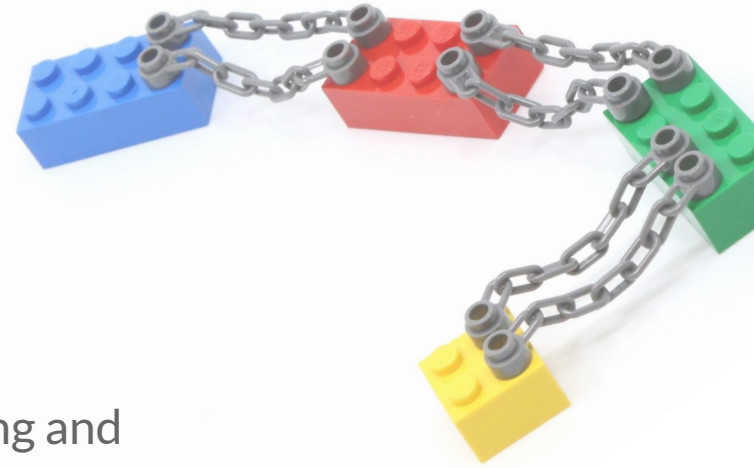


## Conclusions

We presented a framework for the record keeping and evaluation of rating data for recommender system platforms

Rating data stored on a blockchain benefits of immutability and transparency

Smart contracts implement a basic logic for the management of the rating data





## Discussion

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The framework inherits flaws as well, e.g. the gas concept in Ethereum limits the complexity and performance of the framework

Moreover, gas is paid by user in ETH, i.e. money

Twin problem: difficult to guarantee perfect duality of off-chain activities and on-chain storage





## Future steps

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Improve the permission access control to limit un-authorized ratings

Integrate a token economy to incentivize user engagement (**Work in progress**)

Evaluate on different smart contract platforms, and the upcoming Ethereum 2.0



# Thank you!



Lisi A., De Salve A., Mori P., Ricci L. (2019) A Smart Contract Based Recommender System. In: Economics of Grids, Clouds, Systems, and Services. GECON 2019. Lecture Notes in Computer Science, vol 11819. Springer, Cham





Any doubts?



Lisi A., De Salve A., Mori P., Ricci L. (2019) A Smart Contract Based Recommender System. In: Economics of Grids, Clouds, Systems, and Services. GECON 2019. Lecture Notes in Computer Science, vol 11819. Springer, Cham