# Blockchain Performance Benchmarking: a VCG Auction Smart Contract Use Case for Ethereum and Tezos (Short Paper)

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#### 4 — Abstract

The second generation of blockchains introduces the notion of "smart contract" to decentralized ledgers, but with each new blockchain system comes different consensus mechanisms and different approaches on how to assess the cost of computation inside the chain, both aspects that affect the efficiency of the systems as a decentralized computer. We present an experimental comparison of two blockchain systems, namely Ethereum and Tezos, from the perspective of smart contracts, centered around the same implementation of a VCG for Sponsored Search auction algorithm, respectively encoded in Solidity and SmartPy. Our analysis shows the feasibility of implementing an algorithm for sponsored search in such an environment while providing information on how useful these systems can be for this type of smart contracts.

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# 1 Introduction

The presence of "smart contracts", i.e., distributed code snippets, into recent blockchain architectures such as Ethereum [10], EOS [4] or Tezos [3] calls for a comparative performance analysis of their implementations, in terms of running time, storage requirements or cost. Even if some benchmarking work has been done previously, see for instance [7] and [6], we are not aware of work performing a comparative analysis of smart contracts. We report indeed here on preliminary results of such a comparison on two architectures, namely Ethereum and Tezos, using a real-life use case, the Vickrey-Clark-Groves auction for sponsored search (VCG) algorithm.

Our motivation for designing this particular benchmark setting is two-fold. First, we opted to focus on blockchains adhering to different philosophies, the popular and proof-of-work-based Ethereum and the newer and proof-of-stake-based Tezos, to better assess the

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performance characteristics of the blockchain ecosystem. Second, our choice of the VCG algorithm is driven by its importance for search-engine and social-network companies, where advertisements are the main source of revenues. Since these systems, like Facebook, have to mitigate their bottom line and their users' satisfaction, they often opt for this particular type of auction to sell their ads slots, since there advertisers can indeed bid according to their perceived value of each targeted user.

The importance of the reliability and openness of VCG-based ad bidding processes make them a potentially valuable application for smart contracts. In the rest of this paper, we introduce the Ethereum and Tezos approaches to smart contracts (Section 2), specify the VCG algorithm and its implementation as a smart contract (Section 3), present our test protocol (Section 4) and main performance results on both Ethereum and Tezos (Section 5), discuss our main findings (Section 6) and finally conclude (Section 7).

# 2 Ethereum and Tezos Smart Contracts

After its introduction in 2008 with Satoshi Nakamoto's Bitcoin paper, blockchain systems evolved and gained functionalities on top of the peer-to-peer exchange of value. The second generation of blockchains, kick-started by Ethereum, introduced Turing-complete computation, making decentralized applications (dApps) a possibility, via so-called "smart contracts". A smart contract is an autonomous agent that runs on a blockchain and can implement a wide range of applications.

Ethereum is currently the second largest blockchain system, and the first choice for dApps. Its blocks are produced by miners, and the consensus on the blockchain is achieved via the Ethash proof-of-work protocol. Ethereum smart contracts are written in Solidity, a high-level language influenced by C++, Python and JavaScript. Its compiler targets the Ethereum Virtual Machine (EVM), generating EVM opcodes to be executed. Each of these opcodes has a gas cost associated, related to how much computation it requires or storage it manages. Whenever someone tries to execute a transaction to a smart contract, it is necessary to provide a gas limit and a gas price in ETH or Gwei (1.0 ETH =  $10^9$  Gwei) as parameters for the transaction. A miner will execute the transaction until its completion or it runs out of gas, while the user will be debited by the amount of gas used multiplied by the current gas price. Gas is important to insure that the system will not get bogged down by a single contract execution, or be vulnerable to denial-of-service attacks, as well as functioning as a reward system for the miners. There is a gas limit for each block mined, which is voted by the miners; currently, it is  $1.25 \times 10^7$ . As there is a limit to the amount of gas, miners will give preference to transactions with a high price of gas.

Tezos is a third-generation blockchain that intends to address the cost, energy and scalability issues generated by the proof-of-work approach. It uses proof of stake as its consensus mechanism. Funded by the second biggest Initial Coin Offering in 2017, Tezos is characterized by its self-amending properties and its proof-of-stake consensus mechanism. Tezos presents a particular case of proof-of-stake, in which the ability to produce blocks ("baking", in Tezos terminology) can be delegated to another entity, so the name "delegated proof-of-stake". Bakers do not need to perform work as in Ethereum, but rely on access rights linked to "coins" valued in XTZ. Tezos also has a different gas system than Ethereum. A user is charged for each transaction in two different ways: a fee, which is credited to the block baker, and a certain amount of burned coins, sent to an unreachable account. For performing a transaction, a user needs to provide a fee (in XTZ) and a gas limit; the transaction will then compete with other transactions to be added to a block, taking into

account two limitations, namely hard block gas limit (10,400,000 gas) and hard operation gas limit (1,040,000 gas). Bakers will choose transactions, assuming that gas fits the block and fees respects at least a minimum. When the size of the Tezos blockchain storage increases due to a transaction, the sender must, in addition, pay a "burn", in XTZ. This happens when the storage of a contract increases (storage burn) or when a new contract is put on the chain (allocation burn).

# 3 VCG for Sponsored Search Smart Contract

VCG for Sponsored Search (VCG) is a specialization of the Vickrey-Clarke-Groves auction mechanism dedicated to the sale of sponsored links. In this version, the goods being auctioned are "slots" in a web page, and the buyers are advertisers interested in putting one of their ads in a slot. Each slot is associated to a click-through rate ("ctr"), a measure of the number of clicks advertisers can be expected to receive on their ads per number of impressions.

The VCG algorithm, in which n bidders vie for k slots, each with a ctr  $\alpha_j$ , can be outlined as follows, where the ctrs  $\alpha_j$  are assumed down sorted [8]:

- 1. accept a bid  $b_i$  from each bidder i, and relabel the bidders so that  $b_1 \geq b_2 \geq \ldots \geq b_n$ ;
  - **2.** assign each bidder i of the k first bidders to the i-th slot (the others lose);
- 3. charge each such bidder a price  $p_i = \frac{1}{\alpha_i} \sum_{j=i+1}^{k+1} b_j (\alpha_{j-1} \alpha_j)$ , with  $\alpha_{k+1} = 0$ .

Intuitively, the price (per click)  $p_i$  paid by the bidder i is designed to compensate the loss in "social welfare" suffered by all the other bidders by the mere presence of the bidder i. In the framework of search engines, such a VCG algorithm must be run each time a web page is about to be displayed on a computer, meaning billions of times per day.

Implementing VCG as a smart contract varies according to whether one targets Ethereum (Solidity) or Tezos (SmartPy). We strove to have similar code for both implementations to make the comparison as fair as possible, and use the Solidity version for reference here (the full implementation is available at https://github.com/LucasMSg/VCG\_SmartContracts).

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The following data structures are used to implement VCG (unit denotes unsigned integers):

owner(address), the Tezos address of the user who owns the auction smart contract;

isOpen(bool), a flag indicating if an auction is opened at the moment or not;

ctrs(uint[]), the array of ctrs of the slots being auctioned;

bids(uint[]), the bids sent by the advertisers;

agents(address[]), the Tezos addresses of the advertisers;

prices(uint[]), the prices computed at the end of the auction.

## 120 Public functions

Here are the main public functions (entry points, in SmartPy) of a VCG contract (only bid is not reserved to the contract owner):

transferOwnership transfers the contract ownership;

updateCTRs updates the ctrs array, if an auction is not under way;

openAuction opens an auction, providing it an initial ctrs array argument;

bid receives one bid from a participant (the bid and bidder's address are registered);

cancelAuction cancels the auction (the bids and agents are erased);

closeAuction closes the auction, sorts the bid list and computes the VCG prices.

# 4 Test Protocol

Both blockchain development environments provide editors to test contracts, but these tests are being simulated in a sandbox blockchain [2] and are thus not present in an actual blockchain. To provide performance results more representative of actual blockchains, we tested the VCG contract in so-called "testnets", i.e., Ropsten for Ethereum and Delphinet for Tezos. This way we can expect to experience the behavior of a full-fledged blockchain without having to pay transaction fees. To deploy and communicate with contracts, we use Truffle, a development environment for smart contracts initially developed for Ethereum, but for which a Tezos integration, though still under development, presents enough functionalities for our tests. Truffle's contract abstraction provides means to interact with contracts using Javascript.

We implemented a unit test that performs the following transactions on each blockchain: deployment of a VCG smart contract, opening of an auction, sending of bids (to simulate participants) and finally auction closure, producing a table of winners. We opted to deploy a new contract each time the test is performed to better track the possible cost incurred by the addition of more storage to a contract (e.g., the burned XTZ for Tezos). Our full test consists then of a series of unit test auctions with increasing numbers of participants and slots, namely 10 participants with 4 and 8 slots, 20 participants with 4, 8 and 16 slots and 50 participants with 4 slots. We stopped our tests after 50 participants and 4 slots because it was already enough to reach the gas limit of a Ropsten block. We note  $n_m$  an auction with n participants and m slots.

We focused the collection of test data on the most important factors that generally characterize the dynamic performance of contracts. Our use of Truffle also limited the scope of metrics we could put our hands on. For Ethereum, we measured gas usage, setting a large value for both the gas limit and the price to ensure that our transactions would be chosen by the miners and also have enough resources to run our contract to completion (in particular, when closing auctions). For Tezos, Truffle automatically sets the fee and gas limit; at the end of the test, we get the actual gas used and the number of burned coins for the execution of the test contract.

#### 5 Results

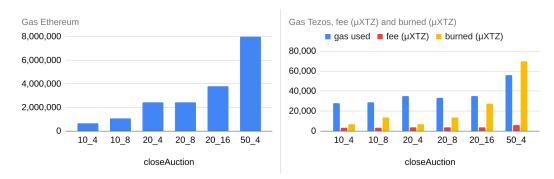
### Gas and Burned

The experimental data obtained vary significantly according to the phase of the VCG auction process and the blockchain on which they run.

**Deployment.** On both blockchains, the gas for deploying the VCG contract is always the same. Ethereum consumes 1,016,192 gas, while Tezos needs 24,017 gas while charging 1.183 XTZ for the allocation of 4,475 bytes.

**Opening.** When opening an auction, the ctrs are stored in the blockchain. As can be expected, the gas and burned increase linearly with the number of slots being auctioned.

Bidding. Bids behave differently on each blockchain. Ethereum is more homogeneous, with the first bid always needing more gas, since it has to set up the array of bids and participants. The first bid consumes 105,917 gas, while the subsequent bids, having only to insert a uint and an address, always consume 75,917 gas. For Tezos, gas consumption increases with a mean of  $208.2 \pm 1.1$  (s.d.) with each subsequent bid, while the amount of coins burned is constantly 0.00925 XTZ or 0.0095 XTZ, depending on the size of the bid.



**Figure 1** For each  $n_m$  VCG contract closing transaction, gas consumption on Ethereum (left) and gas, fee and burned for Tezos (right, where the Y axis scale is in gas and XTZ).

Closing. The close auction function/entry-point is the most relevant for our comparison, since the bulk of the VCG algorithm is performed here. Firstly, the array of bids is sorted (we implemented a simple insertion-sort algorithm) and the sorted array of bids goes through the 3rd step of the VCG algorithm in order to compute the prices for the winners. Figure 5 is a graph of the closing gas for each of our tests. Note that it was not possible to close the 50 bids auction in Ethereum, the gas surpassing what the Ropsten network is accepting as gas limit for a single auction.

#### Block time

When working with smart contacts, "wall-clock" execution time is directly linked to each blockchain block time, since one is only able to see the results of a transaction once the miner/baker has published the block in which the transaction was added. For Ethereum, using Etherscan, we measured the block time at  $14.82 \pm 1.63$  (in seconds), while the Ropsten network clocks at  $14.5 \pm 1.2$  seconds. Note though that Ethereum requests a 2-block wait for confirmation before committing any data to the blockchain. Measuring it directly from Truffle, we got a mean of  $14.16 \pm 7.72$ . For Tezos, its main net is advertised as providing a constant block time of 60 seconds, while Delhinet uses half of it, i.e., 30 seconds. Using Truffle, our tests on Tezos showed a block time of  $43.07 \pm 14.63$  seconds.

# 190 Price

At the end, monetary considerations are what prevail. For our tests, testnet coins are free, so the ETH and XTZ amounts that were spent for this benchmarking had no value. Yet, an approximate prediction of the actual prices one would have to pay to run our VCG contract test can be obtained by taking the main network prices for both of these coins. At of the time of this writing (Mar 10 2021, 10:24 UTC), one ETH is valued at \$1,827, while one XTZ is worth \$4.25.

For Ethereum, we used ETH Gas Station (ethgasstation.info) to get a quote for gas prices. For test purposes, we used the price category "Standard" (91 Gwei/gas at the time of test), which led to the following prices for the deployment and bidding phases: \$168.94, and \$17.6 (first bid) and \$12.6 (subsequent ones). The varying closing phase prices can be deduced from Figure 5, given that the price for a 10\_4 auction was \$128.26.

For Tezos, we used as transaction fees the ones automatically suggested by Truffle, while the burned costs, related to storage increments, are 0.00025 XTZ for 1 byte at the time of test, for both the main and test nets. The prices for the deployment phase are \$0.03 for

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fee and \$5.02 for burned. For the bidding phase, the fee paid by each bidder increases by  $$0.000088 \pm 0.0000029$  each time, while the burned remains somewhat constant, between \$0.039 and \$0.04. For the closing phase, one can refer to Figure 5 to get an estimate, where, for a  $10\_4$  auction, the fee paid by the auctioneer is \$0.133 and the burned, \$0.028.

# 6 Discussion

Our goal with this benchmarking study was to compare the performance of two very similar smart contracts on Ethereum and Tezos. Translating a Solidity contract to the Tezos blockchain environment proved to be quite difficult, even though this could somewhat expected since Ethereum is the most popular dApps platform, with thus a lot of support from its community, while Tezos is much less used for now. From our experience, most complications with Tezos are inherent to its design philosophy. In particular, the self-amending property of this blockchain translates into testnets being abandoned every time there is a new protocol upgrade (every 4 months or so, based on our experience), which led to temporary complications for our study, either because of bugs or because some tools were not adapted to the new testnet as fast as expected.

Presently, Ethereum's gas prices are getting quite high. Adding the system's popularity to the scalability problems of the proof-of-work approach is rising gas prices, which results in a high average transaction fee of \$39.49 (recorded in February 23, 2021). These values could be considered acceptable for a transfer-value system, but, for a dApps platform, they could lead to users abandoning the system. Yet, the EIP 1559 [1] proposal to reform the Ethereum fee market and the introduction of a proof-of-stake approach within Ethereum 2.0 are two welcoming changes that could positively impact the Ethereum results in our benchmarking.

The idea of implementing VCG as a smart contract, though initially appealing due to the archival nature of blockchains and the transparency of its data processing, had some less positive implications. The main one is that all data in a public blockchain is public, which goes against the sealed-bid requirement of VCG. We intend to address this issue in the future, via the inclusion of cryptography contracts similar to [5]. But even if one assumes that bidders are not able to access the blockchain to see the other bids, the bid transaction receipt automatically returned by Ethereum and Tezos could still be used to inform the bidder about the current status of the auction, since, for instance, a big gas consumption for Ethereum means that one has been the first bidder while the always increasing prices for bids in Tezos can help subsequent bidders in figuring out other strategies.

More generally, another hindrance of blockchains for auction is the total time being linked to the block time. In an actual VCG for sponsored search, auctions are made in matters of seconds, which means that a smart contract is not viable for such an application.

## 7 Conclusion

We present a comparative bench-marking use case for smart contracts on the proof-of-work Ethereum and proof-of-stake Tezos blockchains. Our test is based on the VCG auction mechanism widely used in the search-engine industry for advertisement placement, an application that might be thought to be able to profit from the trust and good governance practices blockchains bring to computations. Our experimental data suggest however that, currently, time and space performances (and price, mostly on Ethereum) prevent this type of application to be put to practical use, except maybe in very limited settings (high-value auctioned items among few participants, for instance as in a country-level energy market).

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