# Cicada: A framework for private non-interactive on-chain auctions and voting 

Noemi Glaeser ${ }^{* 1,2}$, István András Seres ${ }^{\dagger 3}$, Michael Zhu ${ }^{\ddagger 4}$, and Joseph Bonneau ${ }^{〔 4,5}$<br>${ }^{1}$ University of Maryland<br>${ }^{2}$ Max Planck Institute for Security and Privacy<br>${ }^{3}$ Eötvös Loránd University<br>${ }^{4}$ a16z crypto research<br>${ }^{5}$ New York University

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#### Abstract

Auction and voting schemes play a crucial role in the Web3 ecosystem. Yet currently deployed implementations either do not offer bid/vote privacy or require at least two rounds, hindering usability and security. We introduce Cicada, a general framework for using linearly homomorphic time-lock puzzles (HTLPs) to enable provably secure, non-interactive private auction and voting protocols. We instantiate our framework with an efficient new HTLP construction and novel packing techniques that enable succinct ballot correctness proofs independent of the number of candidates. We demonstrate the practicality of our approach by implementing our protocols for the Ethereum Virtual Machine (EVM).


## 1 Introduction

Auctions and voting are essential applications of Web3. For example, decentralized marketplaces run auctions to sell digital goods like non-fungible tokens (NFTs) [Ope23b] or domain names [XWY ${ }^{+} 21$ ], while decentralized autonomous organizations (DAOs) deploy voting schemes to enact decentralized governance [Opt23]. Current deployments suffer from limitations hindering widespread adoption:

Lack of bid/ballot privacy: Most deployed auction or voting schemes on blockchains (e.g., NFT auctions on OpenSea [Ope23a] or Uniswap governance [FMW22]) lack bid/ballot privacy. This can negatively influence user behavior, for example by vote herding or discouraging participation [EL03, GY18, SY03]. The lack of privacy can cause surges in congestion and transaction fees as users try to outbid each other to participate, a negative externality for the entire network.

Interactivity: The only deployed private auction we are aware of [XWY $\left.{ }^{+} 21\right]$ deploys a two-round commit-reveal protocol. Interactivity is a usability hurdle that often causes frictions in the protocols' execution. Mandatory bid/ballot reveals are also a target for censorship. A malicious party can bribe the block proposers to exclude certain bids or ballots till the auction/voting ends [PRF23].

We summarize several potential approaches for avoiding interactivity while maintaining privacy in Table 1, including secure multi-party computation (MPC) [BHH18, BK18] and fully homomorphic encryption (FHE) [Gen09]. Unfortunately, these solutions are either computationally costly or rely on trusted third parties.

[^0]|  | Non-interactive | Everlasting privacy | Efficient | No TTPs |
| :---: | :---: | :---: | :---: | :---: |
| Commit-reveal [GY18] | $x$ | $x$ | $\checkmark$ | $\checkmark$ |
| Fully homomorphic TLPs [MT19] | $\checkmark$ | $\checkmark$ | $x$ | $\checkmark$ |
| Fully homomorphic encryption [Gen09] | $\checkmark$ | $\checkmark$ | $x$ | $\checkmark$ |
| Multi-party computation [ $\mathrm{BDJ}^{+} 06$ ] | $x$ | $\checkmark$ | $\checkmark$ | $x$ |
| TLPs + homomorphic encryption [CJSS21] | $\checkmark$ | $x$ | $\checkmark$ | $x$ |
| HTLPs (our approach) | $\checkmark$ | ( $\sqrt{ }$ ) | $\checkmark$ | $\checkmark$ |

Table 1: Qualitative comparison of major cryptographic approaches for designing private auction/voting schemes. (H)TLP stands for (homomorphic) time-lock puzzle. No TTPs refers to the absence of trusted third parties.

### 1.1 Our approach

In this work, we introduce Cicada, a general framework for practical, privacy-preserving, and trust-minimized protocols for both auctions and voting. Cicada uses time-lock puzzles (TLPs) [RSW96] to achieve privacy and noninteractivity in a trustless and efficient manner. Intuitively, the TLPs play the role of commitments to bids/ballots that any party can open after a predefined time, avoiding the reliance on a second reveal round. Since solving a TLP is computationally intensive, ideally we would solve only a sublinear number of TLPs (in the number of voters/bidders) for efficiency. This is achieved using homomorphic TLPs (HTLPs): bids/ballots encoded as HTLPs can be "squashed" into a sublinear number of TLPs. Although fully homomorphic TLPs are not practically efficient, Malavolta and Thyagarajan [MT19] introduced efficient additively and multiplicatively homomorphic TLP constructions. This is enough for simple constructions like first-past-the-post (FPTP) voting, but it remained an open problem how to apply HTLPs to realize more complicated auction and voting protocols.

Our contributions. We show how to use HTLPs to build non-interactive protocols for complex auction and voting schemes. Our protocols are both practically efficient, private, and provably secure, overcoming the following challenges:

Efficient proofs for bid/ballot correctness Users need to prove that their bids/ballots are well-formed according to the auction/voting protocol rules. Designing protocols that admit concretely efficient proofs for bid/ballot correctness is challenging. In particular, we wish to minimize the proof size and the verification cost, since proofs are stored and verified on-chain.

EVM-friendliness We provide open-source, freely available implementations tailored to the popular Ethereum Virtual Machine (EVM) with word size 256 bits. Our most efficient protocols work in $\mathbb{Z}_{N}^{*}$ for $N \approx 2^{1024}$, groups which are not natively supported by EVM. We implement several gas-efficient libraries to support modular arithmetic in such groups-of-unknown-order. We demonstrate in Section 6 that these protocols can be run today on Ethereum Layer 1. Our non-interactive protocols are particularly well-suited to the EVM since, unlike prior works, we do not need to keep bids, ballots, and proofs in persistent storage as they are not required for any subsequent round.

## 2 System Model

Our system design is illustrated in Figure 1. We envision three types of participants in our Cicada-based auction/voting schemes:

Users. We simply refer to voters or bidders as users. Users submit bids or ballots, which we generically call submissions. We assume some external process to establish the set of authorized users (which may be open to all). Once users place their submissions, no further action is required of them.

On-chain coordinator. We refer to the tallier/auctioneer as the coordinator, typically implemented as a smart contract that collects submissions. The coordinator transparently calculates the winner(s). In the case of an auction, they might also transfer (digital) assets to the winner(s). In an election, they might grant special privileges to the winner's public key.


Figure 1: Our model of an HTLP-based auction/voting scheme. (1) Submission phase: users generate their bids/ballots as HTLPs and post them to a public bulletin board, e.g., a blockchain. (2) Aggregation: an on-chain contract homomorphically combines submissions into a single aggregate puzzle. (3) Opening: after the submissions have been aggregated, an off-chain entity solves the aggregate HTLP using $T$ sequential steps and submits the solution to the contract. (4) Finalize: The smart contract may do some final computation over the solution to compute the result and announces the winner. Submission privacy is ensured only until the beginning of the Open phase. In Section 7.1, we show how voters can optionally achieve everlasting ballot privacy.

Off-chain solver. Since our protocols apply HTLPs, we assume an untrusted solver who unlocks the final HTLP(s) off-chain and submits the solution(s) to the coordinator with proofs attached. This could in principle be any party, although, in practice, it will likely be one of the parties participating in (or administering) the vote/auction, or a paid marketplace [AM23, TGB ${ }^{+} 21$ ].

An adversary may attempt to read ballots/bids before the submission phase is completed. This is prevented by the security properties of (H)TLPs (see Section 3.3) assuming the delay parameters $T$ is longer than the submission phase.

## 3 Preliminaries

### 3.1 Notation

We use $[n]$ to denote a range of positive integers $\{1, \ldots, n\}$. For other ranges (mostly zero-indexed), we explicitly write the (inclusive) endpoints, e.g., $[0, n]$. Concatenation of vectors $\mathbf{x}, \mathbf{y}$ is written as $\mathbf{x} \| \mathbf{y}$. We will use $n$ as the number of users, $m$ as the number of candidates, and $w$ as the maximum weight to be allocated to any one candidate in a ballot/bid $(n, m, w \in \mathbb{N})$. For simplicity and without loss of generality, we assume the user identities are unique integers $i \in[n]$. We generally use $i \in[n]$ to index users and $j \in[m]$ for candidates. We use a calligraphic font, e.g., $\mathcal{S}$ or $\mathcal{X}$, to denote sets or domains. When we apply an operation to two sets of equal size $\ell$ we mean pairwise application, e.g., $\mathcal{Z}=\mathcal{X}+\mathcal{Y}$ means $z_{i}=x_{i}+y_{i} \forall i \in[\ell]$. The output $y$ of a randomized algorithm Alg is written as $y \stackrel{R}{\leftarrow} \operatorname{Alg}(x)$ and randomly sampling an element $x$ from a set $\mathcal{X}$ is written as $x \stackrel{R}{\leftarrow} \mathcal{X}$. Many of our algorithms take some public parameters pp as input, and we also drop this input when pp is clear from context.

### 3.2 Auction and voting protocols

We recall the specifics of FPTP, approval, range, and cumulative voting in Appendix A.1. The cryptographically relevant details of these schemes (i.e., the valid ballots' structure: their domain, Hamming weight, and norm) are summarized in Table 2. In Section 5, we create protocols for these schemes of interest.

## 3.3 (Homomorphic) Time-lock puzzles ((H)TLPs)

Time-lock puzzles allow a party to "encrypt" messages to the future. Specifically, to recover the solution, one needs to perform a computation that is believed to be inherently sequential, with a parameterizable number of steps.

|  | Submission domain | Hamming wt | Norm |
| :--- | :---: | :---: | :---: |
| Voting schemes |  |  |  |
| First-past-the-post | $[0,1]^{m}$ | 1 | 1 |
| Approval | $[0,1]^{m}$ | $\leq m$ | $\leq m$ |
| Range | $[0, w]^{m}$ | $\leq m$ | $\leq m$ |
| Cumulative | $[0, w]^{m}$ | $m-1$ | $m(m-1) / 2$ |
| Ranked-choice (Borda) | $\pi([0, m-1])$ | $\leq m$ | $\\|\mathbf{b}\\|_{2}^{2}=\langle\mathbf{b}, \mathbf{b}\rangle=w$ |
| Quadratic (Appendix D.1) | $[0, \sqrt{w}]^{m}$ | 1 | $\leq w$ |
| Single-item sealed-bid auction | $[0, w]$ | 1,1 | $1, \leq m$ |
| Bayesian truth serum (D.2) | $[0,1]^{m} \times \mathbb{N}^{m}$ |  | $\leq$ |

Table 2: Restrictions on a valid submission (bid/ballot) $\mathbf{b}$ for various voting/auction schemes. $\pi(S)$ denotes the set of permutations of $S$, the norm is an $\ell_{1}$ norm unless otherwise specified, $m$ is the number of candidates, and $w$ is the max. vote weight.

Definition 1 (Time-lock puzzle [RSW96]). A time-lock puzzle scheme TLP consists of the following three efficient algorithms:
$\operatorname{TLP} . \operatorname{Setup}\left(1^{\lambda}, T\right) \xrightarrow{R} \mathrm{pp}$. The (potentially trusted) setup algorithm takes as input a security parameter $1^{\lambda}$ and a difficulty (time) parameter $T$, and outputs public parameters pp .

TLP.Gen $(\mathrm{pp}, s) \xrightarrow{R} Z$. Given a solution $s \in \mathbb{Z}$, the puzzle generation algorithm efficiently computes a time-lock puzzle $Z \in \mathbb{G}$.

TLP.Solve $(\mathrm{pp}, Z) \rightarrow s$. Given a TLP $Z$, the puzzle solving algorithm requires at least $T$ sequential steps to output the solution $s$.

Informally, we say that a TLP scheme is correct if TLP.Gen is efficiently computable and TLP.Solve always recovers the original solution $s$ to a validly constructed puzzle. A TLP scheme is secure if $Z$ hides the solution $s$ and no adversary can compute TLP.Solve in fewer than $T$ steps with non-negligible probability. For the formal definitions, we refer the reader to [MT19].

Homomorphic TLPs. Malavolta and Thyagarajan [MT19] introduce homomorphic TLPs (HTLPs). An HTLP is defined with respect to a circuit class $\mathcal{C}$ and has an additional algorithm, Eval, defined as:

HTLP.Eval $\left(\mathrm{pp}, C, Z_{1}, \ldots, Z_{m}\right) \rightarrow Z_{*}$. Given the public parameters, a circuit $C \in \mathcal{C}$ where $C: \mathbb{G}^{m} \rightarrow \mathbb{G}$, and input puzzles $Z_{1}, \ldots, Z_{m}$, the homomorphic evaluation algorithm outputs a puzzle $Z_{*}$.

Correctness requires that HTLP.Solve $\left(Z_{*}\right)$ should contain the expected solution, namely $C\left(s_{1}, \ldots, s_{m}\right)$, where $s_{i} \leftarrow$ HTLP.Solve $\left(Z_{i}\right)$. Again, we refer the reader to [MT19] for the formal definition. Moving forward, we will use $\boxplus$ for homomorphic addition and $\cdot$ for scalar multiplication of HTLPs.

Malavolta and Thyagarajan [MT19] construct two HTLPs with, respectively, linear and multiplicative homomorphisms in groups of unknown order. For our purposes we are only interested in the former, which is based on the Paillier cryptosystem [Pai99]. It uses $N=p q$ a strong semiprime, $g \stackrel{R}{\leftarrow} \mathbb{Z}_{N}^{*}$ and $h=g^{2^{T}}$, and has solution space $\mathbb{Z}_{N}$ :

$$
\begin{equation*}
Z:=\left(g^{r}, h^{r \cdot N}(1+N)^{s}\right) \in \mathbb{J}_{N} \times \mathbb{Z}_{N^{2}}^{*} \tag{1}
\end{equation*}
$$

To recover $s$, a solver must recompute $h^{r}=\left(g^{r}\right)^{2^{T}}$, which is believed to be inherently sequential in a group of unknown order.

As an alternative, we introduce a novel linear HTLP based on the exponential ElGamal cryptosystem [CGS97] which is more efficient when the solution space $\mathcal{S} \subset \mathbb{Z}_{N}$ is small:

$$
\begin{equation*}
Z:=\left(g^{r}, h^{r} y^{s}\right) \in\left(\mathbb{Z}_{N}^{*}\right)^{2} \tag{2}
\end{equation*}
$$

where $g, y \stackrel{R}{\leftarrow} \mathbb{Z}_{N}^{*}$ and again $h=g^{2^{T}}$. This scheme is only practical for small $\mathcal{S}$ since, in addition to recomputing $h^{r}$, recovering $s$ requires brute-forcing the discrete modulus of $y^{s}$. We discuss the efficiency trade-off between these two constructions in Section 6.1 and relegate the construction details to Appendix A.2.

Non-malleability. Introducing a homomorphism raises the issue of puzzle malleability, i.e., the possibility of "mauling" one puzzle (whose solution may be unknown) into a puzzle with a related solution. This could lead to issues when HTLPs are deployed in larger systems, prompting research into non-malleable TLPs [FKPS21]. In our case, we define non-malleability at the system level (Section 4).

### 3.4 Non-interactive zero-knowledge proofs

A proof system $\Pi=$ (Setup, Prove, Verify) is defined with respect to relation $\mathcal{R}_{\mathcal{L}}$ with NP language $\mathcal{L}$ with statementwitness pairs $(x ; \omega) \in \mathcal{R}_{\mathcal{L}}$. We will use non-interactive zero-knowledge proofs (NIZKs) to enforce well-formedness of user submissions while maintaining their secrecy. This prevents users from "poisoning" the aggregate HTLP maintained by the on-chain coordinator. For efficiency, we make use of custom NIZKs (see Appendix C). We refer to [Tha23] for the formal security definitions of NIZKs (soundness and zero-knowledge).

Applied NIZKs in Groups of Unknown Order. Since submissions will be instantiated as HTLPs in our application and all known HTLP constructions use groups of unknown order, our proofs of well-formedness must also operate over these groups. Previous ballot correctness proofs [Gro05] and $\Sigma$-protocols generally operate in groups of prime order and cannot directly be applied in groups of unknown order [BCM05]. To circumvent these impossibility results, we follow the blueprint of [BBF19] and instantiate our protocols in the generic groups of unknown order [DK02] with a common reference string. We detail our constructions in Appendix C.

## 4 Syntax of Time-Locked Voting and Auction Protocols

We now introduce a generic syntax for a time-locked voting/auction protocol. Any such protocol is defined with respect to a base scoring function $\Sigma$ (e.g., second-price auction, range voting). Given a tally submissions (bids/ballots) $s_{1}, \ldots, s_{n} \in \mathcal{X}$, let $\Sigma\left(s_{1}, \ldots, s_{n}\right): \mathcal{X}^{n} \rightarrow \mathcal{Y}$ be the result of the election/auction.

Definition 2 (Time-locked voting/auction protocol). A time-locked voting/auction protocol $\Pi_{\Sigma}=$ (Setup, Seal, Aggr, Open, Finalize) is defined with respect to a base voting/auction protocol $\Sigma: \mathcal{X}^{n} \rightarrow \mathcal{Y}$.
$\operatorname{Setup}\left(1^{\lambda}, T\right) \xrightarrow{R}(\mathrm{pp}, \mathcal{Z})$. Given a security parameter $\lambda$ and a time parameter $T$, output public parameters pp and an initial list of $\operatorname{HTLP}(s) \mathcal{Z}$ that corresponds to the running tally or bid computation.

Seal $(\mathrm{pp}, i, s) \xrightarrow{R}\left(\mathcal{Z}_{i}, \pi_{i}\right)$. User $i \in[n]$ wraps its submission $s \in \mathcal{X}$ in a (list of) $\operatorname{HTLP}(s) \mathcal{Z}_{i}$. It also outputs a proof of well-formedness $\pi_{i}$.
$\operatorname{Aggr}\left(\mathrm{pp}, \mathcal{Z}, i, \mathcal{Z}_{i}, \pi_{i}\right) \rightarrow \mathcal{Z}^{\prime}$. Given a list of (tally) HTLPs $\mathcal{Z}$, time-locked submission $\mathcal{Z}_{i}$ of user $i$, and proof $\pi_{i}$, the transparent contract potentially aggregates the sealed submission homomorphically into $\mathcal{Z}$ to get an updated (tally) $\mathcal{Z}^{\prime}$.

Open $(\mathrm{pp}, \mathcal{Z}) \rightarrow\left(\mathcal{S}, \pi_{\mathrm{open}}\right)$. Open $\mathcal{Z}$ to solution(s) $\mathcal{S}$, requiring $T$ sequential steps, and compute a proof $\pi_{\mathrm{open}}$ to prove correctness of $\mathcal{S}$.

Finalize $\left(\mathrm{pp}, \mathcal{Z}, \mathcal{S}, \pi_{\text {open }}\right) \rightarrow\{y, \perp\}$. Given proposed solution(s) $\mathcal{S}$ to $\mathcal{Z}$ with proof $\pi_{\text {open }}$, the coordinator may run some computation on $\mathcal{S}$ to compute the final result $y \in \mathcal{Y}$, or reject $\mathcal{S}$.

We note that the $\operatorname{Setup}(\cdot)$ algorithm in our protocols may use private randomness. In particular, our constructions use cryptographic groups (RSA and Paillier groups) that cannot be efficiently instantiated without a trusted setup (an untrusted setup would require gigantic moduli [San99]). This trust can be minimized by generating the group via a distributed trusted setup, e.g., [BF01, $\left.\mathrm{CHI}^{+} 21, \mathrm{DM} 10\right]$. Alternatively, the HTLPs in our protocols could be instantiated in class groups [TCLM21], which do not require a trusted setup; however, HTLPs in class groups are less efficient and verifying them on-chain would be prohibitively costly.

A time-locked voting/auction protocol $\Pi_{\Sigma}$ must satisfy the following informal security properties. We define these formally in Appendix B.

Correctness. $\Pi_{\Sigma}$ is correct if, assuming setup, submission of $n$ puzzles, aggregation of all $n$ submissions, and opening are all performed honestly, the finalization procedure outputs a winner consistent with the base protocol $\Sigma$.

Submission privacy. The scheme satisfies submission privacy if the adversary cannot distinguish between two submissions, i.e., bids or ballots. Note that this property is only ensured up to time $T$.

Non-malleability. Notice that submission privacy alone does not suffice for security: even without knowing the contents of other puzzles, an adversary could submit a value that depends on other participants' (sealed) submissions. For example, in an auction, one could be guaranteed to win by homomorphically computing an HTLP containing the sum of all the other participants' bids plus a small value $\epsilon$. Therefore, we also require non-malleability, which requires that no participant can take another's submission and replay it or "maul" it into a valid submission under its own name.

A note on anonymity. We consider user anonymity an orthogonal problem. In the applications we have in mind, users can increase their anonymity by using zero-knowledge mixers [PSS19] or other privacy-enhancing overlays, e.g., zero-knowledge sets [Eth19]. Additionally, users can decouple their identities from their ballots by applying a verifiable shuffle [Nef01], although the on-chain verification of a shuffle proof might be prohibitively costly for larger elections. In Section 7.1 we describe how our protocols can be extended to achieve bid privacy even after the election ends, thus disclosing nothing besides a user's (non-)participation.

## 5 The Cicada framework

### 5.1 Efficient vector encoding for HTLPs

In many voting schemes, a ballot consists of a vector indicating the voter's relative preferences or point allocations for all $m$ candidates. To avoid solving many HTLPs, it is desirable to encode this vector into a single HTLP, which requires representing the vector as a single integer.
Definition 3 (Packing scheme). A setup algorithm PSetup and pair of efficiently computable bijective functions (Pack, Unpack) is called a packing scheme and has the following syntax:

- PSetup $(\ell, w) \rightarrow \mathrm{pp}$. Given a vector dimension $\ell$ and maximum entry $w$, output public parameters pp.
- Pack $(\mathrm{pp}, \mathbf{a}) \rightarrow$ s. Encode $\mathbf{a} \in\left(\mathbb{Z}^{+}\right)^{\ell}$ as a positive integer $s \in \mathbb{Z}^{+}$.
- Unpack $(\mathrm{pp}, s) \rightarrow \mathbf{a}$. Given $s \in \mathbb{Z}^{+}$, recover a vector $\mathbf{a} \in\left(\mathbb{Z}^{+}\right)^{\ell}$.

For correctness we require $\operatorname{Unpack}(\operatorname{Pack}(\mathbf{a}))=\mathbf{a}$ for all $\mathbf{a} \in\left(\mathbb{Z}^{+}\right)^{\ell}$.
The classic approach to packing [Gro05, HS00] uses a positional numeral system (PNS) to encode a vector of entries bounded by $w$ as a single integer in base $M:=w$ (see Construction 1 below). Instead, we will set $M:=n w+1$ to accommodate the homomorphic addition of all $n$ users' vectors: each voter submits a length- $m$ vector with entries $\leq w$. Summing over $n$ voters, the result is a length- $m$ vector with a maximum entry value $n w$; to prevent overflow, we set $M=n w+1$.

Construction 1 (Packing from Positional Numeral System).

- $\operatorname{PSetup}(\ell, w) \rightarrow M:$ Return $M:=w+1$.
- $\operatorname{Pack}(M, \mathbf{a}) \rightarrow s:$ Output $s:=\sum_{j=1}^{|\mathbf{a}|} a_{j} M^{j-1}$.
- Unpack $(M, s) \rightarrow \mathbf{a}:$ Let $\ell:=\left\lceil\log _{M} s\right\rceil$. For $j \in[\ell]$, compute the $j$ th entry of $\mathbf{a}$ as $a_{j}:=s \bmod M^{j-1}$.

We also introduce an alternative approach in Construction 2 which is based on the residue numeral system ( $R N S$ ). The idea of the RNS packing is to interpret the entries of a as prime residues of a single unique integer $s$, which can be found efficiently using the Chinese Remainder Theorem (CRT). In other words, for all $j \in[\ell], s$ captures $a_{j}$ as $s \bmod p_{j}$.

Construction 2 (Packing from Residue Numeral System).

- PSetup $(\ell, w) \rightarrow \mathbf{p}:$ Let $M:=w+1$ and sample $\ell$ distinct primes $p_{1}, \ldots, p_{\ell}$ s.t. $p_{j} \geq M \forall j \in[\ell]$. Return $\mathbf{p}:=\left(p_{1}, \ldots, p_{\ell}\right)$.
- $\operatorname{Pack}(\mathbf{p}, \mathbf{a}) \rightarrow s:$ Given $\mathbf{a} \in\left(\mathbb{Z}^{+}\right)^{\ell}$, use the CRT to find the unique $s \in \mathbb{Z}^{+}$s.t. $s \equiv a_{j}\left(\bmod p_{j}\right) \forall j \in[\ell]$.
- Unpack $(\mathbf{p}, s) \rightarrow \mathbf{a}:$ return $\left(a_{1}, \ldots, a_{\ell}\right)$ where $a_{j} \equiv s \bmod p_{j} \forall j \in[\ell]$.


## The Cicada Framework

Let $\Sigma: \mathcal{X}^{n} \rightarrow \mathcal{Y}$ be an linear voting/auction scheme where $\mathcal{X}=[0, w]^{m}$, HTLP a linear HTLP, $T \in \mathbb{N}$ be a time parameter representing the election/auction length, and a packing scheme (PSetup, Pack, Unpack). Let NIZK be a NIZKPoK for submission correctness (the language depends on $\Sigma$ and HTLP) and PoE a proof of exponentiation (see Appendix C).
$\operatorname{Setup}\left(1^{\lambda}, T, \ell\right) \xrightarrow{R}(\mathrm{pp}, \mathcal{Z})$. Set up the public parameters $\mathrm{pp}_{\mathrm{NIZK}} \stackrel{R}{\leftarrow}$ NIZK.Setup $\left(1^{\lambda}\right), \mathrm{pp}_{\mathrm{tlp}} \stackrel{R}{\leftarrow}$ HTLP.Setup $\left(1^{\lambda}, T\right)$, and $\mathrm{pp}_{\text {pack }} \leftarrow \operatorname{PSetup}(\ell, w)$. Let $\mathcal{Z}=\left\{Z_{j}\right\}_{j \in[m / \ell]}$ where $Z_{j} \stackrel{R}{\leftarrow} \operatorname{HTLP} . \operatorname{Gen}(0)$. Output pp $:=$ $\left(\mathrm{pp}_{\mathrm{tlp}}, \mathrm{pp}_{\text {pack }}, \mathrm{pp}_{\text {NIZK }}\right)$ and $\mathcal{Z}$.

Seal $\left(\mathrm{pp}, i, \mathbf{v}_{i}\right) \xrightarrow{R}\left(\mathcal{Z}_{i}, \pi_{i}\right)$. Parse $\mathbf{v}_{i}:=\mathbf{v}_{i, 1}\|\ldots\| \mathbf{v}_{i, m / \ell}$. Compute $Z_{i, j} \leftarrow \operatorname{HTLP} . \operatorname{Gen}\left(\operatorname{Pack}\left(\mathbf{v}_{i, j}\right)\right) \forall j \in[m / \ell]$ and $\pi_{i} \leftarrow \operatorname{NIZK}$. Prove $\left(\left(i, \mathcal{Z}_{i}\right), \mathbf{v}_{i}\right)$. Output $\left(\mathcal{Z}_{i}:=\left\{Z_{i, j}\right\}_{j \in[m / \ell]}, \pi_{i}\right)$
$\operatorname{Aggr}\left(\mathrm{pp}, \mathcal{Z}, i, \mathcal{Z}_{i}, \pi_{i}\right) \rightarrow \mathcal{Z}^{\prime}$. If $\operatorname{NIZK}$.Verify $\left(\left(i, \mathcal{Z}_{i}\right), \pi_{i}\right)=1$, update $\mathcal{Z}$ to $\mathcal{Z} \boxplus \mathcal{Z}_{i}$.
Open $(\mathrm{pp}, \mathcal{Z}) \rightarrow\left(\mathcal{S}, \pi_{\text {open }}\right)$. Parse $\mathcal{Z}:=\left\{Z_{j}\right\}_{j \in[m / \ell]}$ and solve for the encoded tally $\mathcal{S}=\left\{s_{j}\right\}_{j \in[m / \ell]}$ where $s_{j} \leftarrow \operatorname{HTLP}$.Solve $\left(Z_{j}\right)$. Prove the correctness of the solution(s) as $\pi_{\text {open }} \leftarrow \operatorname{PoE} \operatorname{Prove}\left(\mathcal{S}, \mathcal{Z}, 2^{T}\right)$ and output ( $\mathcal{S}, \pi_{\text {open }}$ ).

Finalize $\left(\mathrm{pp}, \mathcal{Z}, \mathcal{S}, \pi_{\text {open }}\right) \rightarrow\{y, \perp\}$. If $\operatorname{PoE} . \operatorname{Verify}\left(\mathcal{S}, \mathcal{Z}, 2^{T}, \pi_{\text {open }}\right) \neq 1$, return $\perp$. Otherwise, parse $S:=$ $\left\{s_{j}\right\}_{j \in[m / \ell]}$ and let $\mathbf{v}:=\mathbf{v}_{1}\|\ldots\| \mathbf{v}_{m / \ell}$, where $\mathbf{v}_{j} \leftarrow \operatorname{Unpack}\left(s_{j}\right) \forall j \in[m / \ell]$. Output $y$ such that $y=\Sigma(\mathbf{v})$.

Figure 2: The Cicada framework for non-interactive private auctions and elections.

A major advantage of this approach is that, in contrast to the PNS approach, which is only homomorphic for SIMD (single instruction, multiple data) addition, the RNS encoding is fully SIMD homomorphic: the sum of vector encodings $\sum_{i \in[n]} s_{i}$ encodes the vector $\mathbf{a}_{+}=\sum_{i \in[n]} \mathbf{a}_{i}$, and the product $\prod_{i \in[n]} s_{i}$ encodes the vector $\mathbf{a}_{\times}=\prod_{i \in[n]} \mathbf{a}_{i}$. Note that as in the PNS approach, we set $M=n w+1$ to accommodate homomorphic addition of submissions; homomorphic multiplication, however, would require $M=w^{n}+1$, and the primes in $\mathbf{p}$ would therefore be larger as well. Although the RNS has found application in error correction $\left[K P T^{+} 22, T C 14\right]$, sidechannel resistance [PFPB19], and parallelization of arithmetic computations [AHK17, BDM06, GTN11, VNL+20], to our knowledge it has not been applied to voting schemes. We show in Appendix D. 1 that RNS is in fact a natural fit for some voting schemes, leading to more efficient proofs of ballot correctness.

### 5.2 Our framework

We present Cicada, our framework for non-interactive private auctions/elections, in Figure 2. Cicada can be applied to voting and auction schemes with a linear scoring function $\Sigma: \mathcal{X}^{n} \rightarrow \mathcal{Y}$. The framework is instantiated with a linear HTLP (Section 3.3), vector packing scheme (Section 5.1), and matching NIZK for membership in $\mathcal{X}$ to ensure the correctness of submissions.

Theorem 1. Given a linear scoring function $\Sigma$, a secure NIZKPoK NIZK, a secure HTLP, and a packing scheme (PSetup, Pack, Unpack), the Cicada protocol $\Pi_{\Sigma}$ (Figure 2) is a secure time-locked voting/auction protocol.

Intuitively, submission privacy follows from the security of the HTLP and zero-knowledge of the NIZK used: the submission can't be opened before time $T$ and none of the proofs leak any information about it. Non-malleability is enforced by requiring the NIZK to be a proof of knowledge and including the user's identity $i$ in the instance to prove, e.g., including it in the hash payload of the Fiat-Shamir transform. This prevents a malicious actor from replaying a different user's ballot correctness proof. We delegate the full proof to Appendix H.

As we will see below, this encompasses many commonly used schemes such as cumulative voting and sealed-bid auctions. We note that Cicada introduces a crucial design choice via the packing parameter $\ell \in[m]$, which defines a storage-computation trade-off that we detail in Section 6.1.

Additive voting. Many common voting schemes are "additive", meaning each ballot (a length-m vector) is simply added to the tally, and a function $\Sigma$ is applied to the tally after the voting phase has ended to determine the winner. Additive voting schemes include first-past-the-post (FPTP), approval, range, and cumulative voting.

Simple ranked-choice voting schemes, e.g., Borda count [Eme13], are also additive, differing only in what qualifies as a "proper" ballot (restrictions on vector entry domain, vector norm, etc.; see Table 2). Thus we can use Cicada to instantiate private voting protocols for all these schemes.

Sealed-bid auctions. The Cicada framework can also be used to implement a sealed-bid auction with a number of HTLPs which is independent of the number of participants $n$. Assuming bids are bounded by $M$, we use an HTLP with solution space $\mathcal{S}$ such that $|\mathcal{S}|>M^{n}$. Each user $i$ submits $Z_{i} \leftarrow \operatorname{HTLP} . G e n\left(b i d_{i}\right)$ and $\pi_{i}$, where $\pi_{i}$ proves $0 \leq b i d_{i} \leq M$. A packing of the bids is computed at aggregation time, with Aggr updating $Z$ to $Z \boxplus\left(M^{i-1} \cdot Z_{i}\right)$. After the bidding phase, the final "tally" is opened to $s^{*}$ and the bids are recovered as Bids $:=\left\{s^{*}\right.$ $\left.\bmod M^{i-1}\right\}_{i \in[n]}$. Any payment and allocation function can now be computed over the bids; in the simplest case, the winner is $\arg \max _{i}$ (Bids) and their payment is $\max _{i}$ (Bids). Notice that the full set of bids is revealed after the auction concludes. This cannot be avoided when using Cicada with linear HTLPs, since $\max _{i}$ is a nonlinear function, i.e., it cannot be computed it homomorphically.

Locking up collateral is necessary for every (private) auction scheme. We treat the problem of collateral lock-up as an important but orthogonal problem and refer to $\left[\mathrm{TAF}^{+} 23\right]$ for an extensive discussion.

## 6 Performance evaluation

This section evaluates three instantiations of our Cicada framework (Section 5): binary voting, cumulative voting, and a sealed-bid auction. We chose these schemes as they are the most often deployed in today's blockchain ecosystems [Ope23b, Opt, XWY ${ }^{+} 21$. We use the PNS packing system because, for these schemes, it results in more efficient NIZKs than RNS.

### 6.1 Implementation

The choice of Paillier or exponential ElGamal (Equations (1) and (2)) as the HTLP depends on the number of users, candidates, packing scheme, and the computational power of the off-chain solver(s). Exponential ElGamal supports a limited range of $n, m, w$, as one must brute-force the logarithm of $y^{s}$ to recover the puzzle solution $s$, which is upper bounded by $(n w+1)^{m}$ assuming PNS packing. Assuming the largest discrete logarithm an off-chain solver can be expected to brute force has $\tau$ bits if $(n w+1)^{m} \leq 2^{2 \tau}$ then exponential ElGamal can be used; otherwise, Paillier must be used. It is also necessary that $(n w+1)^{m}<|\mathbb{G}|$ to preserve the correctness of our schemes. We detail these limitations and explore the practical parameter range of each HTLP construction in Appendix E.

When both HTLP constructions are possible, exponential ElGamal is more efficient since it operates over $\mathbb{Z}_{N}^{*}$ instead of $\mathbb{Z}_{N^{2}}^{*}$, so we chose it for our implementation. Our transparent on-chain coordinator is implemented as an Ethereum smart contract in Solidity. ${ }^{1}$ We targeted $\lambda=80$ bits of statistical security, choosing a 1024-bit modulus $N$. To enable 1024 -bit modular arithmetic in $\mathbb{Z}_{N}^{*}$, we developed a Solidity library, which may be of independent interest.

The main factors influencing gas cost (see Section 6.2) are submission size, correctness proof size, and verification complexity. These factors mainly depend on the packing parameter $\ell \in[m]$, which determines a storage-computation trade-off with the following extremes:

One aggregate HTLP for all. If $\ell=m$, the contract maintains a single aggregate HTLP $Z$. This greatly reduces the on-chain space requirements of the resulting voting or auction scheme at the expense of typically more complex and larger submission correctness proofs.

One aggregate HTLP per candidate. If $\ell=1$, the contract must maintain $m$ aggregate HTLPs $\left\{Z_{j}\right\}_{j \in[m]}$. This increases the on-chain storage, but the submissions of correctness proofs become smaller and cheaper to verify.

In Section 6.2, we empirically explore this trade-off space by measuring the gas costs of various deployments of our framework with a range of parameter settings $n, m, w, \ell$. First, we briefly describe the proof systems used for each voting and auction scheme we implement; detailed descriptions are given in Appendix C.

[^1]| Cumulative vote $(\ell=1)$ |  |  |  |  |  |
| :--- | :---: | :---: | :---: | :---: | :---: |
| $m$ | 2 | 3 | 4 | 5 | 6 |
| Aggr | $3,391,514$ | $5,081,542$ | $6,781,389$ | $8,489,786$ | $10,208,185$ |
| Finalize | 269,505 | 397,789 | 521,895 | 644,814 | 770,934 |
| Sealed-bid auction $(\ell=1)$ |  |  |  |  |  |
| $b$ | 8 | 10 | 12 | 14 | 16 |
| Aggr | $3,586,022$ | $4,488,050$ | $5,394,047$ | $6,304,164$ | $7,218,905$ |
| Finalize | $1,005,208$ | $1,253,119$ | $1,497,760$ | $1,749,489$ | $2,003,282$ |

Table 3: Gas costs without packing for Cicada cumulative voting and sealed-bid auctions with various numbers of candidates $m$ and bid bit-lengths $b$ (max. bid $M=2^{b-1}$ ). We discuss the cost of a maximally packed auction $(\ell=b)$ in the text, since in that case it is independent of $b$.

Binary voting. In a binary vote (i.e., approval voting with $m=1$ ), such as a simple yes/no referendum, users prove that the submitted ballot $Z=(u, v)$ is an exponential ElGamal HTLP with solution 0 or 1: $\left(u=g^{r} \wedge v=\right.$ $\left.h^{r}\right) \vee\left(u=g^{r} \wedge v y^{-1}=h^{r}\right)$. This is achieved via OR-composition [CDS94] of two Sigma protocols for discrete logarithm equality [CP92].

Cumulative voting. In cumulative voting, each user distributes $w$ votes among $m$ candidates. To accommodate a larger number of candidates, our implementation keeps $m$ tally HTLPs $Z_{j}$, one for each candidate (in other words, $\ell=1$ ). Each voter $i$ submits $m$ ballots $Z_{i j}=\left(g^{r_{i j}}, h^{r_{i j}} y^{s_{i j}}\right)$ for all $j \in[m]$. Besides proving (using the protocol zk-PoKS) that each HTLP is well-formed (the same $r_{i j}$ is used in both terms), the voter must prove that $0 \leq s_{i j} \forall j \in[m]$ and $\sum_{j=1}^{m} s_{i j}=w$. The first condition is shown with a proof of positive solution (zk-PoPS) via Legendre's three-square decomposition theorem [Gro05]. As a building block, we use a proof of square solution (zk-PoKSqS) to show that a puzzle solution is a square. The second condition is proven by providing the randomness $R_{i}=\prod_{j} r_{i j}$ which opens $\prod_{j} Z_{i j}$ to $w$.

Sealed-bid auction. To illustrate two extremes of the packing spectrum, we implement two flavors of sealed-bid auctions. The first uses a single aggregate HTLP as described in Section 5 (this can be viewed as $\ell=b$, where $b=\left\lceil\log _{2}(M)\right\rceil$ is the bit-length of a bid): Bidder $i$ submits a single HTLP $Z_{i}=\left(g^{r_{i}}, h^{r_{i}} y^{s_{i}}\right)$, proving well-formedness with zk-PoKS and two zk-PoPS to show $0 \leq s \leq M$. The coordinator aggregates the $i$ th bidder's bid by adding $M^{i-1} \cdot Z_{i}$ to its tally.

The second approach applies $b$ aggregate HTLPs (i.e., $\ell=1$ ): Each bidder $i$ submits $b$ HTLPs $\left\{Z_{i j}\right\}_{j \in[b]}$ and uses the same proof system as in binary voting to prove their well-formedness, i.e., the user inserted for each bit of the bid 0 or 1 . The coordinator adds $2^{i} \cdot Z_{i j}$ to each corresponding aggregate HTLP $Z_{j}$.

### 6.2 Empirical Performance Evaluation

The on-chain cost of submitting a bid/ballot is the cost of running the Aggr function by the contract, i.e., the verification of the well-formedness proofs plus adding the users' submissions to the tally HTLPs (if and only if they verify). We report our measurements without packing (i.e., $\ell=1$ ) in Table 3 . Submitting a binary vote ballot costs 418,358 gas ( $\approx 11.02$ USD). ${ }^{2}$ For cumulative voting, the submission cost scales linearly in $m$ : with $m=2$ candidates, submitting a ballot costs $3,586,022$ gas ( $\approx 94.49 \mathrm{USD})$, and each additional candidate adds $\approx 1,699,847$ gas ( $\approx 44.79 \mathrm{USD}$ ) .

An auction with a single HTLP for each bit of the bid (the $\ell=1$ case) requires a submission cost of $3,586,022$ gas $(\approx 94.49 \mathrm{USD})$ for an 8 -bit bid. Every additional bit in the submitted bid burns $\approx 451,014$ gas ( $\approx 11.89$ USD)

On the other hand, if one applies packing, i.e., $\ell=b$, then the cost of submitting a sealed bid is constant at $3,055,107$ gas ( $\approx 80.50 \mathrm{USD}$ ). As seen in Table 3 , with bid-space $M=2^{7}$ it is already more economical to have a single aggregate HTLP and use a packing scheme, despite more complex bid-correctness proofs.

[^2]Our voting and auction schemes end with solving the tally HTLP(s) off-chain, i.e., computing $\left(g^{r}\right)^{2^{T}}\left(=h^{r}\right)$. With exponential ElGamal, solving the puzzle requires a brute-force discrete logarithm computation by the offchain solver party. The correctness of this computation is proven to the contract with Wesolowski's proof of exponentiation [Wes19] (recalled in Appendix C). The Finalize cost comes from verifying the Wesolowski proof(s) on-chain, which burns 101,090 gas ( $\approx 2.66$ USD) per proof. Without packing, the untrusted solver must provide a Wesolowski proof per tally HTLP, so the Finalize gas cost is linear in the number of tally HTLPs, as evidenced by Table 3. A portion of the Wesolowki verification cost comes from checking that the challenge is a prime number. In our implementation, the prover provides a primality certificate based on the Baillie-PSW primality test [PSW80], whose verification costs 44,972 gas ( $\approx 1.18 \mathrm{USD}$ ).

## 7 Extensions

### 7.1 Everlasting ballot privacy for HTLP-based protocols

The basic Cicada framework does not guarantee long-term ballot privacy, submissions are public after the Open stage. This is because users publish their HTLPs on-chain: once public, the votes contained in the HTLPs are only guaranteed to be hidden for the time it takes to compute $T$ sequential steps, after which point it is plausible that someone has computed the solution. In many applications, it is desirable that individual ballots remain hidden even after voting has ended since the lack of everlasting privacy may facilitate coercion and vote-buying. As mentioned in Section 4, this can be achieved modularly by first decoupling the ballots from their voters via a privacy-enhancing overlay. Alternatively, we describe how the Seal procedure can be modified to prevent the opening of individual ballots, achieving everlasting privacy.

Observe that all known efficient HTLP constructions are of the form $(u, v)=\left(g^{r}, h^{\prime r} X\right)^{3}$, where the solution is encoded in $X$ and recovering it requires recomputing $h^{r}=\left(g^{r}\right)^{2^{T}}$ via repeated squaring of the first component. Our insight is that the puzzle information-theoretically hides the solution $X$ without the first component. Publishing $g^{r}$ is not necessary in any of our HTLP-based voting protocols except as a means to verifiably compute the first component of the final HTLP, i.e., $g^{R}=g^{\sum_{i \in[n]} r_{i}}$. Realizing that $g^{R}$ can be computed without revealing the individual values $g^{r_{i}}$ enables us to construct the first practical, one-round, private voting protocols that guarantee everlasting ballot privacy.

For simplicity, consider a protocol in which both the ballot of user $i$ and the tally consists of a single HTLP, respectively $Z_{i}=\left(g^{r_{i}}, h^{r_{i}} X_{i}\right)$ and $Z^{*}=\left(g^{R}, h^{R} X^{*}\right)$. Observe that for everlasting ballot privacy, updates to $Z^{*}$ must inherently be batched: a singleton update $\operatorname{Aggr}\left(\mathrm{pp}, Z^{*}, Z_{i}, \pi\right) \rightarrow\left(g^{R+r_{i}}, h^{R+r_{i}} Y^{*}\right)$ (for some $Y^{*}$ ) would reveal $g^{r_{i}}=g^{R+r_{i}} / g^{R}$, which is the opening information to $Z_{i}$, as the quotient of the first component of $Z^{*}$ after and before the update. Hence, the ballot of user $i$ would be recoverable in $T$ sequential steps.

Batching ballot submissions off-chain in groups of $k$ allows parties to achieve everlasting privacy as long as at least one party is honest. Intuitively, the parties compute their aggregate randomness $g^{R}=\prod_{i} g^{r_{i}}$ and a proof $\pi_{\text {batch }}$ of its well-formedness in an MPC. Each party submits only the second component of its ballot to the contract, except party 1, who also submits $g^{R}$. The updated tally HTLP $Z^{*}$ is computed as $\operatorname{Aggr}\left(\mathrm{pp}, Z^{*},\left\{\left(g^{R}, h^{r_{1}} X_{1}\right),\left(g^{0}, h^{r_{2}} X_{2}\right), \ldots\right.\right.$, $\left.\left.\left(g^{0}, h^{r_{k}} X_{k}\right)\right\}, \pi_{\text {batch }}\right)$, where $\pi_{\text {batch }}$ additionally proves to the contract that $\operatorname{dlog}_{g}\left(g^{R}\right)=\operatorname{dlog}_{h}\left(\prod_{i} h^{r_{i}} X_{i}\right)$.

This idea opens up a new design space for the MPC protocol used for batching, such as doing the randomness generation in a preprocessing phase instead, allowing dynamic additions to the anonymity set, optimizing the batch proof generation, and dealing with parties who fail to submit.

### 7.2 Succinct ballot-correctness proofs

Real-world elections often have hundreds of candidates, e.g., Optimism's retroactive public good funding [Opt]. However, the state-of-the-art ballot correctness proofs $\left[\mathrm{BBCG}^{+} 23\right.$, Gro05] for all voting schemes (e.g., majority, approval voting, etc.) are linear in the number of candidates, rendering these schemes impractical in the blockchain setting. To counter these issues, we design constant-size ballot correctness proofs with constant verification time at the expense of an added preprocessing phase. The high-level idea is as follows. All correct ballots (e.g., $\forall s \in$ $\{0,1\}^{m}: \operatorname{Pack}(s)$ in the case of approval voting) are inserted into an accumulator or polynomial commitment (PC) [KZG10] during a transparent preprocessing phase. When users submit their votes $Z \underset{\leftarrow}{\leftarrow}$ HTLP.Gen $(s)$, they prove in zero-knowledge that $Z$ encodes a correct ballot, i.e., the users show that the solution $s$ of $Z$ had been

[^3]previously inserted into the accumulator or PC with a succinct (blinded) membership proof $\left[\mathrm{ZBK}^{+} 22\right]$. We detail our succinct ballot-correctness proof using the KZG commitment in Appendix F.

## 8 Related work

The cryptographic literature on both voting schemes and sealed-bid auctions is enormous, dating to the 1990s. However, the vast majority of these schemes are not suitable for a fully decentralized setting, either due to their inefficiency or their reliance on trusted parties. Below, we review auction and voting protocols that use a blockchain as the public bulletin board.

Voting. The study of voting schemes for blockchain applications dates to at least 2017, when McCorry et al. [MSH17] proposed a "boardroom" voting protocol for DAO governance. The main disadvantage of their protocol is that the entire protocol can be aborted due to a single party. Groth [Gro05] and Boneh et al. [BBCG+23] develop techniques to create ballot correctness proofs for various voting schemes. These protocols all have proofs with size linear in the number of candidates. We break this barrier with the application of polynomial commitments and assuming a transparent, lightweight pre-processing phase. The application of HTLPs to voting was suggested when they were proposed by Malavolta and Thyagarajan [MT19]. However, they left the details of making such a protocol practical, secure, and efficient to future work. We aim to fill this gap with our techniques for various election types and our EVM implementation.

Auctions. Auctions are a natural fit for blockchains and were suggested as early as 2018 [GY18], albeit with a trusted auctioneer. Tyagi et al. proposed Riggs $\left[\mathrm{TAF}^{+} 23\right]$, a fair non-interactive auction scheme using timed commitments [FKPS21, §6]. This is perhaps the closest work to ours in implementing auctions (though not voting) in a fully decentralized setting using time-based cryptography, though their design does not utilize homomorphism to combine puzzles. As a result, gas costs are high and to achieve practicality Riggs relies on an optimistic second round in which users voluntarily open their puzzles. Chvojka et al. suggest a TLP-based protocol for both e-voting and auctions [CJSS21]. Their protocol has a per-auction trusted setup. In Appendix G, we propose a distributed setup protocol to reduce the trust assumption, which may be of independent interest.

Time-based cryptography. Time-based cryptography, which uses inherently sequential functions to delay the revelation of information, also has a lengthy history dating to Rivest, Shamir and Wagner's proposal of time-lock encryption in 1996 [RSW96]. Numerous variants have emerged since then, including timed commitments [BN00], proofs-of-sequential-work [MMV13], VDFs [BBBF18], and homomorphic time-lock puzzles [MT19], which we employ here. For a recent survey we refer the reader to Medley et al. [MLQ23]. The only practical work we know of taking advantage of HTLPs is Bicorn [CATB23], which builds a distributed randomness beacon with a single aggregate HTLP for an arbitrary number of entropy contributors.

## 9 Conclusion and Future Directions

In this work, we introduced Cicada, a framework for creating non-interactive private auction and voting schemes from HTLPs. Our evaluation shows that these schemes can be deployed today on Ethereum, although with gas costs equivalent to tens to hundreds of dollars. In the short-term, deploying on Layer 2 (L2) already brings these costs down by $1-2$ orders of magnitude. For example, casting a binary vote using our scheme costs less than US $\$ 0.30$ today when our implementation is deployed on the Optimism L2 rollup. These numbers can be improved using additional optimizations (e.g., Karatsuba multiplication [KO62] and batched Wesolowski proof verification [Rot21]). In the future, we expect that Cicada verification will be implemented using efficient zkSNARKs (e.g., Groth16 [Gro16], Plonk [GWC19], etc.) to minimize on-chain verification and storage costs.

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## A Extended Preliminaries

In this section, we detail the preliminaries that we could not include in the main body of the paper due to space constraints.

## A. 1 Voting schemes

Majority, approval, range, and cumulative voting. In the majority (or sometimes) binary voting scheme, users can cast 0 (oppose) or 1 (support) for a given candidate (or cause). Approval voting is a slight generalization of binary voting, where users can submit several binary votes for multiple candidates, i.e., the cast ballot $s$ can be seen as $s \in\{0,1\}^{m}$, where $m$ is the number of causes. In a range voting scheme (or score voting), users can give each candidate some weight between 0 and $w$. A similar scheme is cumulative voting, where users can distribute $w$ votes (points) among the candidates. The schemes are summarized in Table 2.

Ranked-choice voting. In a ranked-choice voting scheme (often just ranked voting), voters can signal more fine-grained preferences among $m$ candidates. In the Borda count version [Eme13] of the ranked voting system, each voter can cast $m-1$ points to their first-choice candidate, $m-2$ points to their second-choice candidate, etc. In general, they can cast $m-k$ points to their $k$ th choice. Several other counting functions exist for ranked voting, but in this work, we only focus on Borda counts. Our protocols can easily be adapted to other counting functions, such as the Dowdall system [FG14] via minor modifications.

Construction 3 (Linear HTLP [MT19].).
HTLP.Setup $\left(1^{\lambda}, T\right) \xrightarrow{R}$ pp. Sample a strong semiprime $N$ and a generator $g \stackrel{R}{\leftarrow} \mathbb{Z}_{N}^{*}$, then compute $h=g^{2^{T}}$ $\bmod N \in \mathbb{Z}_{N}^{*}$. (This can be computed efficiently using the factorization of $\left.N\right)$. Output $\mathrm{pp}:=(N, g, h)$.

HTLP.Gen $(\mathrm{pp}, s ; r) \rightarrow Z$. Given a value $s \in \mathbb{Z}_{N}$, use randomness $r \in \mathbb{Z}_{N^{2}}$ to compute and output

$$
Z:=\left(g^{r} \quad \bmod N, h^{r \cdot N} \cdot(1+N)^{s} \quad \bmod N^{2}\right) \in \mathbb{J}_{N} \times \mathbb{Z}_{N^{2}}^{*}
$$

HTLP.Open $(\mathrm{pp}, Z, r) \rightarrow s$. Parse $Z:=(u, v)$ and compute $w:=u^{2^{T}} \bmod N=h^{r}$ via repeated squaring. Output $s:=\frac{\left(v / w^{N} \bmod N^{2}\right)-1}{N}$.

HTLP.Eval(pp, $\left.f, Z_{1}, Z_{2}\right) \rightarrow Z$. To evaluate a linear function $f\left(x_{1}, x_{2}\right)=b+a_{1} x_{1}+a_{2} x_{2}$ homomorphically on puzzles $Z_{1}:=\left(u_{1}, v_{1}\right)$ and $Z_{2}:=\left(u_{2}, v_{2}\right)$, return

$$
Z=\left(u_{1}^{a_{1}} \cdot u_{2}^{a_{2}} \quad \bmod N, v_{1}^{a_{1}} \cdot v_{2}^{a_{2}} \cdot(1+N)^{b} \quad \bmod N^{2}\right)
$$

Construction 4 (Multiplicative HTLP [MT19].).
HTLP.Setup $\left(1^{\lambda}, T\right) \xrightarrow{R}$ pp. Same as construction 3.
HTLP.Gen $(\mathrm{pp}, s ; r) \rightarrow Z$. Given a value $s \in \mathbb{J}_{N}$, use randomness $r \in \mathbb{Z}_{N^{2}}$ to compute and output

$$
Z:=\left(g^{r} \quad \bmod N, h^{r} \cdot s \quad \bmod N\right) \in \mathbb{Z}_{N}^{*} \times \mathbb{Z}_{N}^{*}
$$

HTLP.Open $(\mathrm{pp}, Z, r) \rightarrow s$. Parse $Z:=(u, v)$ and compute $w:=u^{2^{T}} \bmod N=h^{r}$ via repeated squaring. Output $s:=v / w$.

HTLP.Eval(pp, $\left.f, Z_{1}, Z_{2}\right) \rightarrow Z$. To evaluate a multiplicative function $f\left(x_{1}, x_{2}\right)=a x_{1} x_{2}$ homomorphically on puzzles $Z_{1}:=\left(u_{1}, v_{1}\right)$ and $Z_{2}:=\left(u_{2}, v_{2}\right)$, return

$$
Z=\left(u_{1} \cdot u_{2} \quad \bmod N, a \cdot v_{1} \cdot v_{2} \quad \bmod N\right)
$$

Figure 3: The HTLP constructions of [MT19].

## A. 2 HTLP Constructions

Malavolta and Thyagarajan [MT19] give two HTLP constructions with linear and multiplicative homomorphisms, respectively. They require $N$ to be a strong semiprime, i.e., $N=p \cdot q$ such that $p=2 p^{\prime}+1$ and $q=2 q^{\prime}+1$ where $p^{\prime}, q^{\prime}$ are also prime. The linearly-homomorphic HTLP is based on Paillier encryption [Pai99], while the multiplicative homomorphism is achieved by working over the subgroup $\mathbb{J}_{N} \subseteq \mathbb{Z}_{N}^{*}$ of elements with Jacobi symbol +1 . We recall their constructions in Figure 3.

Correctness of the linear HTLP holds because for all $s \in \mathbb{Z}_{N}$ and $Z=(u, v) \leftarrow \operatorname{HTLP} . G e n(p p, s)$,

$$
\begin{equation*}
\operatorname{HTLP} . O p e n(\mathrm{pp}, Z)=\frac{\left(v /\left(h^{R}\right)^{N} \quad \bmod N^{2}\right)-1}{N}=\frac{\left((1+N)^{s}\right)-1}{N}=s \tag{3}
\end{equation*}
$$

since $(1+N)^{x}=1+N x \bmod N^{2}$. Correctness of the homomorphism follows since for all linear functions $f\left(x_{1}, x_{2}\right)=$ $b+a_{1} x_{1}+a_{2} x_{2}$ and all $Z_{i}=\left(u_{i}, v_{i}\right) \in \operatorname{Im}\left(H T L P . G e n\left(p p, s_{i} ; r_{i}\right)\right)$ for $i \in\{1,2\},{ }^{4}$

$$
\begin{aligned}
& \text { HTLP.Eval }\left(\mathrm{pp}, f, Z_{1}, Z_{2}\right)=\left(u_{1}^{a_{1}} \cdot u_{2}^{a_{2}},(1+N)^{b} \cdot v_{1}^{a_{1}} \cdot v_{2}^{a_{2}}\right) \\
&=\left(g^{r_{1} a_{1}} \cdot g^{r_{2} a_{2}},\right. \\
&\left.(1+N)^{b} \cdot h^{r_{1} N a_{1}} \cdot(1+N)^{s_{1} a_{1}} \cdot h^{r_{2} N a_{2}} \cdot(1+N)^{s_{2} a_{2}}\right) \\
&=\left(g^{r_{1} a_{1}+r_{2} a_{2}},\right. \\
&=\text { HTLP.Gen }\left(\mathrm{pp}, f\left(s_{1}, s_{2}\right) ; r_{1} a_{1}+r_{2} a_{2}\right)
\end{aligned}
$$

[^4]Construction 5 (Efficient linear HTLP.).
HTLP.Setup $\left(1^{\lambda}, T\right) \xrightarrow{R}$ pp. Same as constructions 3 and 4.
HTLP.Gen $(\mathrm{pp}, s ; r) \rightarrow Z$. Given a value $s \in \mathcal{S} \subset \mathbb{Z}_{N}$, use randomness $r \in \mathbb{Z}_{N}$ to compute and output

$$
Z:=\left(g^{r} \quad \bmod N, h^{r} \cdot y^{s} \quad \bmod N\right) \in \mathbb{Z}_{N}^{*} \times \mathbb{Z}_{N}^{*}
$$

HTLP.Open $(\mathrm{pp}, Z, r) \rightarrow s$. Parse $Z:=(u, v)$ and compute $w:=u^{2^{T}} \bmod N=h^{r}$ via repeated squaring. Compute $S:=v / w$ and brute force the discrete logarithm of $S$ w.r.t. y to obtain $s$.

HTLP.Eval(pp, $\left.f, Z_{1}, Z_{2}\right) \rightarrow Z$. To evaluate a linear function $f\left(x_{1}, x_{2}\right)=b+a_{1} x_{1}+a_{2} x_{2}$ homomorphically on puzzles $Z_{1}:=\left(u_{1}, v_{1}\right)$ and $Z_{2}:=\left(u_{2}, v_{2}\right)$, return

$$
Z=\left(u_{1}^{a_{1}} \cdot u_{2}^{a_{2}} \quad \bmod N, v_{1}^{a_{1}} \cdot v_{2}^{a_{2}} \cdot y^{b} \quad \bmod N\right)
$$

Figure 4: Efficient linear HTLP for small solution space.
which opens to $f\left(s_{1}, s_{2}\right)$ by eq. (3).
The multiplicative HTLP operates over the solution space $\mathbb{J}_{N}$ (instead of $\mathbb{Z}_{N}$ ). It is easy to see that HTLP.Open(pp, HTLP.Gen $(\mathrm{pp}, s))=s$ for all $s \in \mathbb{Z}_{N}^{*}$. Furthermore, for all $f\left(x_{1}, x_{2}\right)=a x_{1} x_{2}$ and all $Z_{i}=\left(u_{i}, v_{i}\right) \in \operatorname{Im}(H T L P . G e n(p p$, $\left.s_{i} ; r_{i}\right)$ ) for $i \in\{1,2\}$,

$$
\left.\begin{array}{rlrl}
\text { HTLP. } & \text { Eval }\left(\mathrm{pp}, f, Z_{1}, Z_{2}\right)=\left(u_{1} \cdot u_{2}\right. & \bmod N, a \cdot v_{1} \cdot v_{2} & \bmod N
\end{array}\right)
$$

Thus correctness holds.
Lifting the multiplicative HTLP to put $s$ in the exponent yields a more efficient linear HTLP for a small solution space $\mathcal{S} \subset \mathbb{Z}_{N}$ (Figure 4, changes shown in blue). This can be viewed as a construction based on exponential ElGamal encryption.

## B Properties of Time-Locked Voting/Auction Protocols

Here we formally define the properties of time-locked voting/auction protocols (Definition 2).
Definition 4 (Correctness). We say a voting/auction protocol $\Pi_{\Sigma}$ with $\Sigma: \mathcal{X}^{n} \rightarrow \mathcal{Y}$ is correct if for all $T, \lambda \in \mathbb{N}$ and submissions $s_{1}, \ldots, s_{n} \in \mathcal{X}$,

$$
\operatorname{Pr}\left[\begin{array}{c|c}
\text { Finalize }\left(\mathrm{pp}, \mathcal{Z}_{\text {final }}, \mathcal{S}, \pi_{\text {open }}\right) & (\mathrm{pp}, \mathcal{Z}) \stackrel{R}{\leftarrow} \operatorname{Setup}\left(1^{\lambda}, T\right) \wedge \\
=\Sigma\left(s_{1}, \ldots, s_{n}\right) & \left(\mathcal{Z}_{i}, \pi_{i}\right) \underset{\mathcal{Z}_{\text {final }}}{\leftarrow} \leftarrow \operatorname{Sggr}\left(\mathrm{pp}, \mathcal{Z},\left\{i, \mathcal{Z}_{i}, \pi_{i}\right\}_{i \in[n]}\right) \wedge \\
& \left(\mathcal{S}, \pi_{\text {open }}\right) \leftarrow \operatorname{Open}\left(\mathrm{pp}, \mathcal{Z}_{\text {final }}\right)
\end{array}\right]=1
$$

where the aggregation step is performed over all $n$ submissions in any order.
Definition 5 (Submission privacy). We say that a voting/auction protocol $\Pi_{\Sigma}$ with $\Sigma: \mathcal{X}^{n} \rightarrow \mathcal{Y}$ is submission private if for all $T, \lambda \in \mathbb{N}, i \in[n]$ and all PPT adversaries $\mathcal{A}$ running in at most $T$ sequential steps, there exists a negligible function $\operatorname{negl}(\cdot)$ such that

$$
\operatorname{Pr}\left[b=b^{\prime} \left\lvert\, \begin{array}{c}
(\mathrm{pp}, \mathcal{Z}) \stackrel{R}{\leftarrow} \operatorname{Setup}\left(1^{\lambda}, T\right) \wedge \\
b \stackrel{R}{\leftarrow}\{0,1\} \wedge \\
\left(\mathcal{Z}_{i}, \pi_{i}\right) \stackrel{R}{\leftarrow} \operatorname{Seal}(\mathrm{pp}, i, b) \wedge \\
b^{\prime} \leftarrow \mathcal{A}\left(\mathrm{pp}, \mathcal{Z}, i, \mathcal{Z}_{i}, \pi_{i}\right)
\end{array}\right.\right] \leq \frac{1}{2}+\operatorname{negl}(\lambda)
$$

Definition 6 (Non-malleability). We say that a voting/auction protocol $\Pi_{\Sigma}$ with $\Sigma: \mathcal{X}^{n} \rightarrow \mathcal{Y}$ is non-malleable if for all $T, \lambda \in \mathbb{N}$ and all PPT adversaries $\mathcal{A}$ running in at most $T$ sequential steps, there exists a negligible function negl( $\cdot$ ) such that

$$
\operatorname{Pr}\left[\begin{array}{c|c}
\operatorname{Aggr}\left(\mathrm{pp}, \mathcal{Z}, i, \mathcal{Z}_{i}, \pi_{i}\right) \neq \mathcal{Z} \wedge & (\mathrm{pp}, \mathcal{Z}) \stackrel{R}{\leftarrow} \operatorname{Setup}\left(1^{\lambda}, T\right) \wedge \\
\left(i, \cdot \cdot \mathcal{Z}_{i}, \pi_{i}\right) \notin \mathcal{Q} & \left(i, \mathcal{Z}_{i}, \pi_{i}\right) \leftarrow \mathcal{A}^{\mathcal{O}_{\text {Seal }}(\mathrm{pp}, \cdot \cdot \cdot}(\mathrm{pp}, \mathcal{Z})
\end{array}\right] \leq \operatorname{negl}(\lambda)
$$

where $\mathcal{O}_{\text {Seal }}(\mathrm{pp}, \cdot, \cdot)$ is an oracle which takes as input any $j \in[n]$ and $s_{j} \in \mathcal{X}$ and outputs $\left(\mathcal{Z}_{j}, \pi_{j}\right) \stackrel{R}{\leftarrow} \operatorname{Seal}\left(\mathrm{pp}, j, s_{j}\right)$, and $\mathcal{Q}$ is the set of queries and responses $\left(j, s_{j}, \mathcal{Z}_{j}, \pi_{j}\right)$ to the oracle.

## C HTLP ballot correctness proofs

## C. 1 Proof of Solution

During the finalization phase of a our protocol, any party can solve the final HTLP off-chain and submit a solution to the contract. To enforce the correctness of this solution we require the solver to include a proof of the following relation:

$$
\begin{equation*}
\mathcal{R}_{\mathrm{PoS}}=\left\{((h, y, u, v, w \in \mathbb{G}, s \in \mathbb{Z}) ; \perp): w=u^{2^{T}} \wedge v=w y^{s} \in \mathbb{G}\right\} \tag{4}
\end{equation*}
$$

This can be realized as the conjunction of two proofs of exponentiation, namely for $w=u^{2^{T}}$ and for $y^{s}=v / w$. In more detail, a Proof of Exponentiation (PoE) [Pie18, Wes19] is a proof for the following relation:

$$
\mathcal{R}_{\mathrm{PoE}}=\left\{((u, w \in \mathbb{G}, x \in \mathbb{Z}) ; \perp): w=u^{x} \in \mathbb{G}\right\}
$$

Note that there is no witness in the $\mathcal{R}_{\text {PoE }}$ relation, i.e., the verifier knows the exponent $x$. The primary goal of the PoE proof system for the verifier is to outsource a possibly large exponentiation in a group $\mathbb{G}$ of unknown order.

## Wesolowski's proof of exponentiation protocol (PoE)

Public parameters: $\mathbb{G} \stackrel{R}{\leftarrow} G G e n(\lambda)$.
Public inputs: $u, w \in \mathbb{G}, x \in \mathbb{Z}$.
Claim: $u^{x}=w$.

1. $\mathcal{V}$ sends $l \stackrel{R}{\leftarrow} \operatorname{Primes}(\lambda)$ to $\mathcal{P}$.
2. $\mathcal{P}$ computes $q=\left\lfloor\frac{x}{l}\right\rfloor \in \mathbb{Z} \wedge r \in[l]$, where $x=q l+r$. $\mathcal{P}$ sends $Q=u^{q} \in \mathbb{G}$ to $\mathcal{V}$.
3. $\mathcal{V}$ computes $r=x \bmod l$.
$\mathcal{V}$ accepts iff $w=Q^{l} u^{r}$.
Observe that the verifier sends a prime number as a challenge. When we make this protocol non-interactive via the Fiat-Shamir transform, we use a standard HashToPrime $(\cdot)$ function to generate the correct challenge for the prover. In our implementation, we use the Baillie-PSW primality test [PSW80] to show that a randomly hashed challenge is indeed prime.

## C. 2 Proofs of well-formedness

To prove that HTLP ballots are well-formed during the submission phase, we will use several different proofs of knowledge about TLP solutions. We assume HTLPs of the form $(u, v)=\left(g^{r}, h^{r} y^{s}\right) \in \mathbb{G}_{1} \times \mathbb{G}_{2}$, where $\mathbb{G}_{1}, \mathbb{G}_{2}$ are groups of unknown order. This captures all known constructions of HTLPs: in the case of the Paillier HTLP (Construction 3), $\mathbb{G}_{1}=\mathbb{J}_{N}, \mathbb{G}_{2}=\mathbb{Z}_{N^{2}}^{*}, h=\left(g^{2^{T}}\right)^{N}$, and $y=1+N$. For the exponential ElGamal HTLP (Construction 5), $\mathbb{G}_{1}=\mathbb{G}_{2}=\mathbb{Z}_{N}^{*}, h=g^{2^{T}}$, and $y \in \mathbb{G}_{1}$. Most of our protocols make use of the fact that for such HTLPs, $v$ has the same structure as a Pedersen commitment [Ped92].

Since we are operating in groups of unknown order, to circumvent the impossibility result of [BCK10] and achieve negligible soundness error for Schnorr-style Sigma protocols, we assume access to some public element(s) of $\mathbb{G}_{1}, \mathbb{G}_{2}$ whose representations are unknown. We prove security assuming $\mathbb{G}_{1}, \mathbb{G}_{2}$ are generic groups output by some randomized algorithm $G G e n(\lambda)$. For more on instantiating Schnorr-style protocols in groups of unknown order while maintaining negligible soundness error, see [BBF19].

Well-formedness and knowledge of solution. To prove knowledge of a puzzle solution in zero-knowledge, our starting point is the folklore Schnorr-style protocol for knowledge of a Pedersen-committed value. Our protocol zk-PoKS is shown below.

## zkPoK of TLP solution (zk-PoKS)

Public parameters: $\mathbb{G}_{1}, \mathbb{G}_{2} \stackrel{R}{\leftarrow} G G e n(\lambda), b>2^{2 \lambda}\left|\mathbb{G}_{i}\right| \forall i \in\{1,2\}$, and $g \in \mathbb{G}_{1}, h, y \in \mathbb{G}_{2}$.
Public input: HTLP $Z=(u, v)$.
Private input: $s, r \in \mathbb{Z}$ such that $Z=\left(g^{r}, h^{r} y^{s}\right)$.

1. $\mathcal{P}$ samples $\alpha, \beta \stackrel{R}{\leftarrow}[-b, b]$ and sends $A:=h^{\alpha} y^{\beta}, B:=g^{\alpha}$ to $\mathcal{V}$.
2. $\mathcal{V}$ sends a challenge $e \stackrel{R}{\leftarrow}\left[2^{\lambda}\right]$.
3. $\mathcal{P}$ computes $w=r e+\alpha$ and $x=s e+\beta$, which it sends to $\mathcal{V}$.
$\mathcal{V}$ accepts iff the following hold:

$$
\begin{array}{r}
v^{e} A=h^{w} y^{x} \\
u^{e} B=g^{w}
\end{array}
$$

Equality of solutions. Again, our starting point is the folklore protocol of equality of Pedersen-committed values: given two HTLPs with second terms $v_{1}, v_{2}$, if the solutions are equal the quotient is $v_{1} / v_{2}=h^{r_{1}-r_{2}}$. To prove the equality of the solutions, it therefore suffices to show knowledge of the discrete logarithm of $v_{1} / v_{2}$ with respect to $h$ using Schnorr's classic Sigma protocol [Sch90] with the previously described adjustments. Because of its simplicity we do not explicitly write out the protocol, which we will refer to as zk-PoSEq.

Binary solution. In an FPTP (or majority) vote for $m=2$ candidates, users only need to prove that their ballot $\left(g^{r}, h^{r} y^{s}\right)$ encodes 0 or 1 . More formally, users prove the statement $\left(u=g^{r} \wedge v=h^{r}\right) \vee\left(u=g^{r} \wedge v y^{-1}=h^{r}\right)$. This can be proved using the OR-composition [CDS94] of two discrete logarithm equality proofs [CP92] with respect to bases $g$ and $h$ and discrete logarithm $r$. A similar proof strategy could be applied if the user has multiple binary choices, e.g., approval and range voting. The OR-composition of multiple discrete logarithm equality proofs yields a secure ballot correctness proof for those voting schemes.

Positive solution. We use Groth's trick [Gro05], based on the classical Legendre three-square theorem from number theory, to show that a puzzle solution $s$ is positive by showing that $4 s+1$ can be written as the sum of three squares. Our protocol deals only with the second component of the TLP, making use of the proof of solution equality (zk-PoSEq) described above and a proof that a TLP solution is the square of another (zk-PoKSqS, described next).

## Proof of positive solution (zk-PoPS)

Public parameters: $\mathbb{G}_{2} \stackrel{R}{\leftarrow} G G e n(\lambda)$, a secure HTLP, and $h, y \in \mathbb{G}_{2}$.
Public input: $v \in \mathbb{G}_{2}$ such that $(\cdot, v) \in \operatorname{Im}$ (HTLP.Gen).
Private input: $s, r \in \mathbb{Z}$ such that $v=h^{r} y^{s}$ and $s>0$.

1. Find three integers $s_{1}, s_{2}, s_{3} \in \mathbb{Z}$ such that $4 s+1=s_{1}^{2}+s_{2}^{2}+s_{3}^{2}$ and, for each $j=1,2,3$, compute two HTLPs:

$$
\begin{aligned}
& Z_{j} \leftarrow \operatorname{HTLP} \cdot G e n\left(s_{j}\right) \\
& Z_{j}^{\prime} \leftarrow \operatorname{HTLP} \cdot G e n\left(s_{j}^{2}\right)
\end{aligned}
$$

2. Use zk-PoKSqS to compute a proof $\sigma_{j}$ of square solution for each pair $\left(Z_{j}, Z_{j}^{\prime}\right)$ for $j=1,2,3$.
3. Use zk-PoSEq to compute a proof $\sigma_{\text {eq }}$ of solution equality for $4 \cdot Z \boxplus 1$ and $Z_{1}^{\prime} \boxplus Z_{2}^{\prime} \boxplus Z_{3}^{\prime}$.

The full proof consists of $\left(\sigma_{1}, \sigma_{2}, \sigma_{3}, \sigma_{\text {eq }}\right)$, all computed with the same challenge $e \in\left[2^{\lambda}\right]$.

Square solution. To prove that a puzzle solution is the square of another, we use a conjunction of two zk-PoKS variants which proves knowledge of the same solution with respect to different bases. In particular, we consider only the second terms $v_{1}=h^{r_{1}} y^{s}$ and $v_{2}=h^{r_{2}} y^{s^{2}}$. We use the fact that $v_{2}$ can be rewritten as $h^{r_{2}-r_{1} s} v_{1}^{s}$ and prove that its opening w.r.t. base $v_{1}$ equals the opening of $v_{1}$.

## Proof of square solution (zk-PoKSqS)

Public parameters: $\mathbb{G}_{2} \stackrel{R}{\leftarrow} G G e n(\lambda), b>2^{2 \lambda}\left|\mathbb{G}_{2}\right|$, and $h, y \in \mathbb{G}_{2}$.
Public input: $v_{1}, v_{2} \in \mathbb{G}_{2}$.
Private input: $s, r_{1}, r_{2} \in \mathbb{Z}$ such that $v_{1}=h^{r_{1}} y^{s}$ and $v_{2}=h^{r_{2}} y^{s^{2}}=h^{r_{2}-r_{1} s} v_{1}^{s}$.

1. $\mathcal{P}$ samples $\alpha_{1}, \alpha_{2}, \beta \stackrel{R}{\leftarrow}[-b, b]$ and sends $A_{1}:=h^{\alpha_{1}} y^{\beta}, A_{2}:=h^{\alpha_{2}} v_{1}^{\beta}$ to $\mathcal{V}$.
2. $\mathcal{V}$ sends a challenge $e \stackrel{R}{\gtrless}_{\leftarrow}^{\leftarrow}\left[2^{\lambda}\right]$.
3. $\mathcal{P}$ computes $w_{1}=r_{1} e+\alpha_{1}, w_{2}=\left(r_{2}-r_{1} s\right) e+\alpha_{2}$, and $x=s e+\beta$, which it sends to $\mathcal{V}$.
$\mathcal{V}$ accepts iff the following hold:

$$
\begin{aligned}
& v_{1}^{e} A_{1}=h^{w_{1}} y^{x} \\
& v_{2}^{e} A_{2}=h^{w_{2}} v_{1}^{x}
\end{aligned}
$$

## C. 3 Verification gas costs on Ethereum

We implemented the above Sigma protocols in Solidity and report their verification gas costs in Table 4. Recall that with Groth's trick [Gro05] in the proof of positivity (zk-PoPS), we must to decompose the integer solution into the sum of only three squares. Therefore the gas cost of verifying zk-PoPS is equal to the cost of verifying three proofs of knowledge of square solutions (zk-PoKSqS) and one proof of knowledge of equal solution (zk-PoSEq).

| Sigma protocol | Verification gas cost |
| :--- | ---: |
| Proof of Exponentiation (Wesolowski PoE [Wes19]) | 101,066 |
| PoK of solution (zk-PoKS) | 266,096 |
| Proof of solution equality (zk-PoSEq) | 336,155 |
| Proof of square solution(zk-PoKSqS) | 336,168 |
| Proof of positive solution (zk-PoPS) | $1,351,958$ |

Table 4: EVM gas cost of verification for the proofs in Appendix C.

## D Additional voting and scoring protocols

## D. 1 Quadratic voting

In quadratic voting [LW18], each user's ballot is a vector $\mathbf{b}=\left(b_{1}, \ldots, b_{m}\right)$ such that $\langle\mathbf{b}, \mathbf{b}\rangle=\|\mathbf{b}\|_{2}^{2} \leq w$. Once again, the winner is determined by summing all the ballots and determining the candidate with the most points. Thus, this is also an additive voting scheme. However, proving ballot well-formedness efficiently in this particular case benefits greatly from the novel application of the residue numeral system (RNS) to private voting (see Section 5.1).

Each voter $i$ submits two linear HTLPs: $Z_{i}^{\text {tally }}$ containing $s_{i}$ and $Z_{i}^{\text {norm }}$ containing $s_{i}^{2}$, where $s_{i}$ is an encoding of the ballot $\mathbf{b}_{i}$. $Z_{i}^{\text {tally }}$ will be accumulated into the running tally as usual, and $Z_{i}^{\text {norm }}$ will be used to enforce the norm bound. A well-formed sealed ballot is therefore of the form $Z_{i}=\left(Z_{i}^{\text {tally }}, Z_{i}^{\text {norm }}\right)$ such that:

Check \#1. The vector entries enclosed in $Z_{i}^{\text {norm }}$ are the squares of those enclosed in $Z_{i}^{\text {tally }}$.
Check \#2. $Z_{i}^{\text {norm }}$ has $\ell_{1}$ norm strictly equal to $w .{ }^{5}$

[^5]The first check is much simpler and more efficient when using RNS packing. Recall that with this packing, a solution $s$ encodes the ballot $\left(b_{1}, \ldots, b_{m}\right)$ as $s \bmod p_{j} \equiv b_{j} \forall j \in[m]$, and that this encoding is fully SIMD homomorphic. It follows that $s^{2} \bmod p_{j} \equiv b_{j}^{2}$ for all $j \in[m] .{ }^{6}$ With the RNS packing, it, therefore, suffices to prove a square relationship once for the puzzles encoding $s$ and $s^{2}$ (e.g., using zk-PoKSqS) rather than $m$ times for all the vector entries. This is in contrast to the PNS packing used by all previous private voting schemes in the literature, where the absence of a multiplicative homomorphism would require proving the square relationship for every vector entry individually.

Regardless of the vector encoding, the second check is more involved: the user needs to open a sum of vector entries (the residues) without revealing the entries (residues) themselves. One approach would be for the user to commit to each vector entry in $Z_{i}^{\text {norm }}$, i.e., $a_{i j}=s_{i}^{2} \bmod p_{j}$, with a Pedersen commitment, and use a variant proof of knowledge of exponent modulo $p_{j}$ (PoKEMon [BBF19]) to show the commitments contain the appropriate values $a_{i j}$. Then it can open the sum of the commitments. PoKEMonproofs are batchable, so the contract can verify them efficiently and check that the sum of the commitments opens to $w$.

## D. 2 Bayesian truth serum

Bayesian truth serum [Pre04] is a method for eliciting truthful subjective answers where objective truth does not exist or is not knowable. The core of the idea is to reward answers that are "surprisingly common" by leveraging respondents' own predictions of what will be common. Thus, for a question with many (mutually exclusive) potential answers, the score of user $i$ responding $\mathbf{x}_{i}:=\left(x_{i 1}, \ldots, x_{i m}\right)$ and $\mathbf{y}_{i}:=\left(y_{i 1}, \ldots, y_{i m}\right)$ is calculated as

$$
\begin{equation*}
\operatorname{score}_{i}:=\sum_{j \in[m]} x_{i j} \log \frac{\bar{x}_{j}}{\bar{y}_{j}}+\alpha \sum_{j \in[m]} \bar{x}_{j} \log \frac{y_{i j}}{\bar{x}_{j}} \tag{5}
\end{equation*}
$$

where $\alpha>0$ is a constant. The variable $x_{i j} \in\{0,1\}$ denotes user $i$ 's decision (choose or don't choose) for option $j \in[m], \bar{x}_{j}$ is the empirical frequency of choice $j$ over all the users' answers, $y_{i j}$ is user $i$ 's estimate of $\bar{x}_{j}$ (i.e., their estimate of the probability of answer $j$ among all users), and $\bar{y}_{j}$ is the empirical (geometric) average of $y_{i j}$ over all the users' answers. Since each user can only choose a single answer, $x_{i j}$ will be 0 for all but one value of $j$, which we denote $j^{*}$. Thus, we can think of the equation above as equivalent to

$$
x_{i j^{*}} \log \frac{\bar{x}_{j^{*}}}{\bar{y}_{j^{*}}}+\alpha \sum_{j \in[m]} \bar{x}_{j} \log \frac{y_{i j}}{\bar{x}_{j}} .
$$

The first term is referred to as the information score and the second as the prediction score. The information score is highest when the user's choice $k^{*}$ is "surprisingly common", i.e., when the empirical frequency of answer $j^{*}\left(\bar{x}_{j^{*}}\right)$ is higher than the crowd's estimate of the empirical frequency of $j^{*}\left(\bar{y}_{j^{*}}\right)$. Therefore participants are incentivized to submit their truthful responses, even (and especially) if they believe them to be uncommon.

The prediction score is the Kullback-Leibler divergence [KL51] between the user's estimate of the average answer and the true average answer, weighted by $\alpha$. This is maximized when the two values are equal (i.e., the divergence is 0 ), and so incentivizes truthful reporting of $y_{i j}$, the user's estimate of $\bar{x}_{j}$.

We show how Bayesian truth serum can be implemented in the Cicada framework. First, rewrite Equation (5) as

$$
\begin{equation*}
\operatorname{score}_{i}:=\sum_{j \in[m]} x_{i j}\left(\log \bar{x}_{j}-\bar{y}_{j}^{\prime}\right)+\alpha \sum_{j \in[m]} \bar{x}_{j}\left(y_{i j}^{\prime}-\log \bar{x}_{j}\right) \tag{6}
\end{equation*}
$$

where $y_{i j}^{\prime}=\log y_{i j}$ and $\bar{y}_{j}^{\prime}=\log \bar{y}_{j}$. The smart contract will use two (lists of) HTLPs $\mathcal{Z}_{\overline{\mathbf{x}}}^{\text {tally }}, \mathcal{Z}_{\overline{\mathbf{y}}^{\prime}}^{\text {tally }}$ to keep track of two running "tallies":

$$
\begin{aligned}
& \overline{\mathbf{x}}=\left(\bar{x}_{1}, \ldots, \bar{x}_{m}\right) \\
&=\sum_{i} \mathbf{x}_{i} \\
& \overline{\mathbf{y}}^{\prime}=\left(\bar{y}_{1}^{\prime}, \ldots, \bar{y}_{m}^{\prime}\right)=\sum_{i} \frac{1}{n} \mathbf{y}_{i}^{\prime}
\end{aligned}
$$

Each user's ballot consists of the vectors $\mathbf{x}_{i}, \mathbf{y}_{i}^{\prime}$, where $\mathbf{x}_{i} \in[0,1]^{m}$ has $\ell_{1}$ norm 1 and $\mathbf{y}_{i}^{\prime}=\log \mathbf{y} \in \mathbb{N}^{m}$ with $\sum_{j \in[m]} y_{i j}=n$. Assuming no packing for simplicity, the ballot is encoded as three lists of HTLPs: a list of linear

[^6]HTLPs $\mathcal{Z}_{i}^{\text {ans }}:=\left\{Z_{i j}^{\text {ans }}\right\}_{j \in[m]}$ for the entries of $\mathbf{x}_{i}$, and two lists of (respectively) linear and multiplicative HTLPs $\mathcal{Z}_{i}^{+}:=\left\{Z_{i j}^{+}\right\}_{j \in[m]}$ and $\mathcal{Z}_{i}^{\times}:=\left\{Z_{i j}^{\times}\right\}_{j \in[m]}$, both encoding the entries of $\mathbf{y}_{i}^{\prime}$. The smart contract coordinator must ensure that the following hold:

Check \#1a. All $Z_{i j}^{\text {ans }}$ encode $x_{i j} \in[0,1]$.
Check \#1b. $\sum_{j \in[m]} x_{i j}=1$.
Check \#2a. All $Z_{i j}^{+}$encode $y_{i j}^{\prime}>0$.
Check \#2b. $\sum_{j \in[m]} 2^{y_{i j}^{\prime}}=n$ (assuming log base 2).
Check \#3. $Z_{i j}^{\times}$contains the same value as $Z_{i j}^{+}$for all $j \in[m]$.
Most of these checks can be achieved using the protocols in Appendix C: Check \#1a with the binary solution protocol, $\# 1 \mathrm{~b}$ and $\# 2 \mathrm{~b}$ by providing randomness which opens the homomorphic sum to the correct value, and $\# 2 \mathrm{a}$ with zk-PoPS. Check \#2b additionally requires a zero-knowledge proof of exponentiation, e.g., [BBF19]. Because the puzzles to check in $\# 3$ use different constructions, we can't apply zk-PoSEq directly; instead, one can combine two zk-PoKS proofs with a standard PoK for discrete logarithm.

The aggregation algorithm $\operatorname{Aggr}\left(\left(\mathcal{Z}_{\overline{\mathbf{x}}}^{\text {tally }}, \mathcal{Z}_{\overline{\mathbf{y}}^{\prime}}^{\text {tall }}\right), i, \mathcal{Z}_{i}, \pi_{i}\right)$ updates the tally to $\left(\mathcal{Z}_{\overline{\mathbf{x}}}^{\text {tally }} \boxplus \mathcal{Z}_{i}^{\text {ans }}, \mathcal{Z}_{\overline{\mathbf{y}}^{\prime}}^{\text {tally }} \boxplus \frac{1}{n} \cdot \mathcal{Z}_{i}^{+}\right)$. During the opening phase, anyone can solve for the final tallies $\overline{\mathbf{x}}_{\text {final }}, \overline{\mathbf{y}}_{\text {final }}^{\prime}$ and the individual user submissions $\left\{\left(\mathbf{x}_{i}, \mathbf{y}_{i}^{\prime}\right)\right\}_{i \in[n]}$. If correct, they are used in Finalize to compute the final set of scores as follows:

1. Let $\overline{\mathbf{x}}^{\prime}:=\log \overline{\mathbf{x}}$. Compute $\mathbf{I}^{\prime}:=\overline{\mathbf{x}}^{\prime}-\overline{\mathbf{y}}^{\prime}$ and $\mathbf{P}^{\prime}:=\overline{\mathbf{x}} \cdot \overline{\mathbf{x}}^{\prime}$.
2. For each user $i \in[n]$ :
(a) Compute $i$ 's information score $I_{i}:=\sum_{j \in[m]} I_{i j}$, where $\mathbf{I}_{i}=\left(I_{i 1}, \ldots, I_{i m}\right):=\mathbf{x}_{i} \cdot \mathbf{I}^{\prime}$.
(b) Compute $i$ 's prediction score $P_{i}:=\sum_{j \in[m]} P_{i j}$, where $\mathbf{P}_{i}=\left(P_{i 1}, \ldots, P_{i m}\right):=\overline{\mathbf{x}} \cdot \mathbf{y}_{i}^{\prime}-\mathbf{P}^{\prime}$.
(c) User $i$ 's score is $I_{i}-P_{i}$.

## E Practicality of HTLP-based Auction and Voting Schemes in Various Cryptographic Groups

In this section, we evaluate the practicality of auction and voting schemes using HTLPs in various parameter settings. As discussed in Section 5.1, the size of the applied integer representations of ballots/bids increases linearly in certain parameters of the voting/auction schemes, e.g., the number of candidates. This limits the applicability of certain HTLP constructions instantiated in specific cryptographic groups as we show next.


Figure 5: Practicality of auction and voting schemes in various parameter settings, i.e., number of users, candidates, and largest bid. For this comparison, we considered the security parameter $\lambda=80$, which corresponds to a 1024-bit modulus $N$ for exponential ElGamal and Paillier HTLPs and 3400-bit discriminants for class group HTLPs. For the exponential ElGamal HTLP, we considered a maximum allowed ballot size $2^{80}$, which translates into $\approx 2^{40}$ brute forcing work using, for instance, Pollard's rho algorithm [Pol78].

## Preprocessing ballots for succinct ballot-correctness proofs

Public parameters: The common reference string crs $:=\left\{g_{1}^{\tau^{j}}\right\}_{j=1}^{d} \in \mathbb{G}_{1}^{d}$. A semiprime $N$ and $h, y \in \mathbb{Z}_{N}^{*}$. A voting scheme $\Sigma: \mathcal{X}^{n} \rightarrow \mathcal{Y}$, e.g., approval voting.

1. Let $\mathcal{X}$ be the set of correct ballots and $|\mathcal{X}|=d$
2. Let $f(x) \in \mathbb{F}_{\bar{p}}^{\leq d}[x]$ be a univariate polynomial s.t. $\forall s_{i} \in \mathcal{X}: f(i):=\operatorname{Pack}\left(s_{i}\right)$. The polynomial $f(x)$ could be computed using Lagrangian interpolation.
3. Let com be the KZG commitment to the polynomial $f$.

Output: com.

Figure 6: Preprocessing ballots to enable succinct ballot-correctness proofs.

Let us assume that the classic positional number system is used as a packing function; see Section 5.1. In the case of voting schemes, we have that for the cryptographic group $\mathbb{G}$, in which the HTLP is instantiated, it needs to hold that $(n w+1)^{m} \leq|\mathbb{G}|$ to preserve correctness, i.e., to avoid overflows. For ease of simplicity, in Figure 5, we set $w=1$. In the case of auction schemes, for similar reasons, we have that it needs to hold that $M^{n} \leq|\mathbb{G}|$, where $M$ is the maximum allowed bid in the auction scheme in an appropriate denomination of a currency.

Exponential ElGamal HTLP. This is the most efficient HTLP construction, see Construction 5, i.e., for a given security parameter, the Exponential ElGamal HTLP has the smallest required cryptographic groups and most efficient group operations which makes it a great fit for blockchain applications. However, the Exponential ElGamal HTLP also has two significant drawbacks. First, the puzzle solution is encoded in the exponent; hence, it must be brute-forced. This one-time discrete logarithm computation needs to be computed by the puzzle solver. Nonetheless, this weakness severely limits the possible parameter settings for auction and voting schemes with the Exponential ElGamal HTLP.

Paillier HTLP. This is a slightly less efficient construction, see Construction 3, as the size of the HTLPs for a given security parameter is doubled since the Paillier HTLP works $\bmod N^{2}$ instead of $\bmod N$. This both increases the space costs of this solution and the complexity of the group operation. On the other hand, a great advantage of the Paillier HTLP is that it supports a much broader parameter setting for a given security parameter.

Class group HTLP. The sole HTLP candidate without a trusted setup [TCLM21]. Class group HTLPs require the largest groups for a given security parameter. They are not widely adopted and supported by major cryptographic libraries. Additionally, their costly group operation makes them not a great target for blockchain applications. We are unaware of any class group implementation for Ethereum smart contracts.

Impractical parameter settings. To circumvent these parameters, one needs to increase the security parameter to obtain larger cryptographic groups. This might result in intolerably inefficient cryptographic groups for certain applications.

## F Succinct ballot-correctness proofs from polynomial commitments

In this section, we assume that a common reference string for the KZG polynomial commitment (PC) scheme [KZG10] is already available to users, namely crs $:=\left\{g_{1}^{\tau^{j}}\right\}_{j=1}^{d}$, where $g_{1} \in \mathbb{G}_{1}$ is a generator in a bilinear pairing-friendly cyclic group $\mathbb{G}_{1}$ over $\mathbb{F}_{p}$ for some prime $p, \tau \stackrel{R}{\leftarrow} \mathbb{F}_{p}$ hidden to everyone. The crs is typically established during a sequential, secure multi-party computation (MPC), e.g., [BGG18].

Let us assume that users have established during a preprocessing phase (Figure 6) a short commitment com that encodes all the possible ballots in a particular voting scheme, e.g., $\mathcal{X}=[0,1]^{m}$ for approval voting. The size of classical proofs of well-formedness, e.g., OR-composition of Sigma-protocols, scale linearly in the number of
candidates $m$. The following proof strategy yields a constant-size proof of correctness for moderately-sized $\mathcal{X}$, i.e., $|\mathcal{X}| \leq d^{7}$.

First, given a ballot $Z=\left(g^{r}, h^{r} y^{s}\right) \in \tilde{\mathbb{G}}_{1} \times \tilde{\mathbb{G}}_{2}$, the user creates an elliptic curve point $Z_{1}=h_{1}^{r} y_{1}^{s} \in \mathbb{G}_{1}$ for random generators $h_{1}, y_{1} \stackrel{R}{\leftarrow} \mathbb{G}_{1}$ in a pairing-friendly group. Using the discrete logarithm across different groups techniques developed in [COPZ22], the user can show that $Z$ and $Z_{1}$ have the same discrete logarithms $r$ and $s$ with for their bases $h, y \in \mathbb{G}, h_{1}, y_{1} \in \mathbb{G}_{1}$, respectively. Now that $Z_{1}$ and the polynomial commitment are in the same pairing-friendly group $\mathbb{G}_{1}$, the user can create a blinded KZG opening proof [ $\mathrm{ZBK}^{+} 22$ ] to prove ballot correctness. Specifically, the proof $\pi$ shows that the value $s$ in $Z_{1}$ matches an evaluation of the polynomial $f$ committed by com at some (hidden) point $j$, i.e., $f(j)=s$. Note that the verifier only sees constant-size commitments of $f, j$, and $s$. Since the blinded KZG proof $\pi$ is also constant-size, this strategy yields the first succinct ballot-correctness proofs for many common voting schemes, e.g., approval and range voting.

## G A trusted setup protocol for the CJSS scheme

Chvojka, Jager, Slamanig, and Striecks [CJSS21] describe how to combine a public-key encryption scheme with a TLP to obtain a private voting or auction protocols which, unlike the HTLP-based approach suggested by [MT19], is "solve one, get many for free". The high-level idea of the protocol is to encrypt each user's bid with a common public key whose corresponding secret key is inserted into a TLP (see Figure 7). Therefore, none of the bids can be decrypted until the corresponding encryption secret key is obtained by solving the TLP. One drawback of this scheme, however, is that it requires an additional trusted setup procedure to create a TLP containing the secret key corresponding to the encryption public key used. Furthermore, unlike the HTLP approach, the setup cannot be reused and must be re-run for every protocol invocation.

## The CJSS Framework

Let $\Pi_{\mathrm{E}}$ be a CCA-secure public-key encryption scheme, TLP a time-lock puzzle scheme, and $\Sigma: \mathcal{X}^{n} \rightarrow \mathcal{Y}$ a base voting/auction protocol.
$\operatorname{Setup}\left(1^{\lambda}, T\right) \xrightarrow{R}(\mathrm{pp}, \mathcal{Z})$. Sample a key-pair $(\mathrm{pk}, \mathrm{sk}) \leftarrow \Pi_{\mathrm{E}} \cdot \mathrm{Gen}\left(1^{\lambda}\right)$ and TLP parameters $\mathrm{pp}_{\mathrm{tlp}} \leftarrow$ TLP.Setup $\left(1^{\lambda}, T\right)$. Compute $Z_{\text {sk }} \stackrel{R}{\leftarrow}$ TLP.Gen $\left(\mathrm{pp}_{\mathrm{tlp}}, \mathrm{sk}\right)$ and return $\mathrm{pp}:=\left(\mathrm{pp}_{\mathrm{tlp}}, \mathrm{pk}\right)$ and $\mathcal{Z}:=\left(Z_{\text {sk }}, \perp\right)$.
Seal $(\mathrm{pp}, i, s) \xrightarrow{R}\left(\mathrm{ct}_{i}, \pi_{i}\right)$. Parse pk from pp and compute an encrypted bid/ballot as $\mathrm{ct}_{i} \leftarrow \Pi_{\mathrm{E}}$.Enc(pk, $\left.s_{i}\right)$ along with a proof $\pi_{i}$ that $\mathrm{ct}_{i}$ is a valid encryption under pk.
$\operatorname{Aggr}\left(\mathrm{pp}, \mathcal{Z}, \mathrm{ct}_{i}, \pi_{i}\right) \rightarrow \mathcal{Z}^{\prime}$. Verify $\pi_{i}$. If the check passes, parse $\mathcal{Z}:=\left(Z_{\text {sk }}, \mathcal{C}\right)$ and update to $\mathcal{Z}^{\prime}:=\left(Z_{\text {sk }}, \mathcal{C} \cup\left\{\mathrm{ct}_{i}\right\}\right)$.
Open $(\mathrm{pp}, \mathcal{Z}, \perp) \rightarrow$ sk. Let $\mathcal{Z}:=\left(Z_{\mathrm{sk}}, \mathcal{C}\right)$ and publish sk $\leftarrow$ HTLP.Solve $\left(\mathrm{pp}_{\mathrm{tlp}}, Z_{\mathrm{sk}}\right)$.
Finalize $(\mathrm{pp}, \mathrm{sk}) \rightarrow y$. Use the secret key sk to decrypt each ciphertext $\mathrm{ct}_{i} \in \mathcal{C}$ to $s_{i} \leftarrow \Pi_{\mathrm{E}}$. $\operatorname{Dec}\left(\mathrm{sk}, \mathrm{ct}_{i}\right)$. Compute the final result in the clear as $\Sigma\left(s_{1}, \ldots, s_{n}\right)$.

Figure 7: The "solve one, get many for free" paradigm (CJSS) [CJSS21].
We observe that, for encryption schemes with discrete-log key-pairs such as Cramer-Shoup [CS98], there is a natural decentralized setup protocol secure against all-but-one corruptions. Using the blockchain as a broadcast channel (similar to [NRBB22]), a simple sequential MPC protocol to set up the parameters works as follows. Suppose there is some smart contract that stores the public key pk $=g^{\text {sk }} \bmod N$ and a TLP $Z_{\text {sk }}$ containing sk (initially, one can set $\mathrm{sk}=0$ ). Each contributor $i$ can update pk by adding $s_{i}$ homomorphically in the exponent and contributing an HTLP $Z_{i}=\left(g^{r_{i}} \bmod N, h^{r_{i} \cdot N} \cdot(1+N)^{s_{i}}\right)$. The contribution must be accompanied by a proof of well-formedness. For the previous state $\mathrm{pk}, Z_{\mathrm{sk}}$, contributor $i$ proves that its contribution $\mathrm{pk}_{i}, Z_{i}$ passes the following checks:

Check \#1. It knows the discrete logarithm of $\mathrm{pk}_{i}$ with respect to the base $g$. This can be achieved with a proof of knowledge of the exponent [Sch90].

[^7]Check \#2. It knows the representation of the HTLP contribution $Z_{i}$ with respect to the bases $g, h^{N}$, (1+N) (i.e., the discrete logarithms $r_{i}, r_{i}, s_{i}$ ). This can be proven by a "knowledge of representation" proof system in groups of unknown order (e.g., the PoKE family of proofs [BBF19]; see Section 3.4).

Check \#3. Finally, the discrete logarithms $a, b, c$ from check $\# 2$ are such that $a=b$ and $c=\operatorname{dlog}_{g}\left(\mathrm{pk}_{i}\right)$.
The state is updated with the $i$ th contribution iff all the checks pass. After the update, $Z_{\text {sk }}:=Z_{\text {sk }} \cdot Z_{i}$ and $\mathrm{pk}:=\mathrm{pk} \cdot \mathrm{pk}_{i}=g^{s+s_{i}}$. A single honest contributor suffices to guarantee a uniformly distributed keypair.

## H Security Proofs

We use $\mathcal{D}_{1} \approx_{\lambda} \mathcal{D}_{2}$ to denote that two distributions $\mathcal{D}_{1}, \mathcal{D}_{2}$ have statistical distance bounded by negl $(\lambda)$.

## H. 1 The Cicada framework

Proof of Theorem 1. For simplicity, we give a proof for the simple case of $\mathcal{X}=[0,1]$, i.e., submissions consist of a single bit, but our argument generalizes to larger domains $\mathcal{X}$. Let $n \in \mathbb{N}$ be the number of users.

The correctness of the Cicada framework (cf. Definition 4) follows by construction and from the correctness of the underlying building blocks (i.e., soundness in the case of NIZKs).

Next, we prove submission privacy. Let $\operatorname{ExpSPriv}_{\Pi_{\Sigma}}^{\mathcal{A}}(\lambda, T, i)$ be the original submission privacy game for the Cicada scheme $\Pi_{\Sigma}$ with $T$-bounded adversary $\mathcal{A}$, cf. Definition 5 . We define a series of hybrids to show that $\operatorname{Pr}\left[\operatorname{ExpSPriv}{\underset{\Pi}{\Sigma}}_{\mathcal{A}}^{( }(\lambda, T, i)=1\right] \leq \operatorname{neg}(\lambda)$ for all $\lambda, T \in \mathbb{N}$ and $i \in[n]$.
$\mathcal{H}_{0}$ : This is the original game $\operatorname{ExpSPriv} \mathcal{H}_{\Sigma}(\lambda, T, i)$, where $Z_{i} \leftarrow \operatorname{HTLP}$.Gen $(b)$ and $\pi_{i} \leftarrow \operatorname{NIZK}$.Prove $\left(i, Z_{i}, b\right)$.
$\overline{\mathcal{H}_{1}}$ : Replace $\pi$ with $\tilde{\pi} \leftarrow$ NIZK. $\operatorname{Sim}\left(i, Z_{i}\right)$. $\mathcal{H}_{1}$ is indistinguishable from $\mathcal{H}_{0}$ by the zero-knowledge property of NIZK.
$\mathcal{H}_{2}$ : Replace $Z_{i}$ with $Y_{i} \leftarrow$ HTLP.Gen $(1-b)$ and $\tilde{\pi}$ with $\tilde{\sigma} \leftarrow \operatorname{NIZK} \cdot \operatorname{Sim}\left(i, Y_{i}\right) . \mathcal{H}_{1}$ and $\mathcal{H}_{2}$ are indistinguishable because the distributions $\left\{Z_{i}, \operatorname{Sim}\left(i, Z_{i}\right)\right\}$ and $\left\{Y_{i}, \operatorname{Sim}\left(i, Y_{i}\right)\right\}$ are indistinguishable since $\left\{Z_{i}\right\},\left\{Y_{i}\right\}$ are indistinguishable by the security of HTLP.
$\mathcal{H}_{3}$ : Replace $\tilde{\sigma}$ with $\sigma \leftarrow \operatorname{NIZK}$. $\operatorname{Prove}\left(i, Y_{i}, 1-b\right) . \mathcal{H}_{3}$ is indistinguishable from $\mathcal{H}_{2}$ by the zero-knowledge property of NIZK.

This series of hybrids implies $\operatorname{Pr}\left[b^{\prime}=b\right] \approx_{\lambda} \operatorname{Pr}\left[b^{\prime}=1-b\right]$, where $b^{\prime}$ is the output of $\mathcal{A}$ in $\mathcal{H}_{0}$ or $\mathcal{H}_{3}$, respectively. Therefore $\operatorname{Pr}\left[\operatorname{ExpSPriv}{\underset{\Pi}{\Gamma}}_{\mathcal{A}}(\lambda, T, i)=1\right] \leq \frac{1}{2}+\operatorname{negl}(\lambda)$.

Finally, we show that if NIZK is a PoK and HTLP is secure, then Cicada is non-malleable, cf. Definition 6. Suppose towards a contradiction that Cicada is malleable. We will use this and the fact that NIZK is a PoK to construct an adversary $\mathcal{B}$ which has non-negligible advantage in the HTLP security game. Again, we work in the simple case $\mathcal{X}=[0,1]$, i.e., $m, \ell, w=1$, but the argument generalizes to other parameter settings.

Since by our assumption Cicada is malleable, there exists $\mathcal{A}$ which outputs $\left(i, \cdot, \mathcal{Z}_{i}, \pi_{i}\right) \notin \mathcal{Q}$ such that NIZK.Verify $((i$, $\left.\left.\mathcal{Z}_{i}\right), \pi\right)=1$ with non-negligible probability. Given a puzzle $Z_{b}$ containing some unknown bit $b, \mathcal{B}$ works as follows. First, it computes $(\mathrm{pp}, Z) \stackrel{R}{\leftarrow} \operatorname{Setup}\left(1^{\lambda}, T, 1\right)$ and sends them to the non-malleability adversary $\mathcal{A}$. $\mathcal{B}$ responds to $\mathcal{A}$ 's oracle queries $\left(j, b_{j}\right)$ with honestly computed $\left(Z_{j}, \pi_{j}\right)$, keeping track of queries and responses in the set $\mathcal{Q}$. When $\mathcal{A}$ outputs $\left(i, Z_{i}, \pi_{i}\right), \mathcal{B}$ looks for $\left(i, b_{i}, Z_{i}, \pi_{i}\right) \in \mathcal{Q}$ and outputs $b_{i}$. Since $\mathcal{A}$ has non-negligible advantage, it follows that NIZK.Verify $\left(\left(i, Z_{i}\right), \pi_{i}\right)=1$. This implies that either $\operatorname{Pr}\left[b_{i}=b\right]=\frac{1}{2}+$ negl $(\lambda)$ or NIZK is not knowledge sound. Both possibilities contradict our assumptions, namely that the HTLP is secure and the NIZK is knowledge sound. Thus, Cicada must be non-malleable.

## H. 2 Sigma Protocols

We prove special-soundness and honest-verifier zero-knowledge (HVZK) of our Sigma protocols (Appendix C). Any such protocol can be made into a non-interactive zero-knowledge proof of knowledge (NIZKPoK) via the Fiat-Shamir transform [FS87].

Theorem 2 (zk-PoKS). The protocol zk-PoKS in Appendix C. 2 is a special sound and HVZK proof system in the generic group model.

Proof. For special soundness, we show that given two distinct accepting transcripts with the same first message, i.e., $(A, B, e, w, x)$ and $\left(A, B, e^{\prime}, w^{\prime}, x^{\prime}\right)$ where $e \neq e^{\prime}$, we can extract the witnesses $r, s$. The proof follows the blueprint
of the proof of Theorem 10 in [BBF19]. Since the transcripts are accepting, we have

$$
\begin{aligned}
h^{w} y^{x} & =v^{e} A \\
& =h^{r e+\alpha} y^{s e+\beta}
\end{aligned}
$$

$$
\begin{aligned}
h^{w^{\prime}} y^{x^{\prime}} & =v^{e^{\prime}} A \\
& =h^{r e^{\prime}+\alpha} y^{s e^{\prime}+\beta}
\end{aligned}
$$

Combining the two equations we get

$$
\begin{align*}
h^{r \Delta e} y^{s \Delta e} & =h^{\Delta w} y^{\Delta x} \\
\Longleftrightarrow \quad v^{\Delta e} & =h^{\Delta w} y^{\Delta x} \tag{7}
\end{align*}
$$

where $\Delta e=e-e^{\prime}$ and $\Delta y, \Delta x$ are defined similarly. Then with overwhelming probability, $r \Delta e=\Delta w$ and $s \Delta e=\Delta x$ (cf. Lemma 4 of [BBF19]), so $\Delta e \in \mathbb{Z}$ divides $\Delta w \in \mathbb{Z}$ and $\Delta x \in \mathbb{Z}$ and we can extract $r, s \in \mathbb{Z}$ as $r=\Delta w / \Delta e$ and $s=\Delta x / \Delta e$.

We will now show that these values are correct, i.e., $v=h^{\Delta w / \Delta e} y^{\Delta x / \Delta e}$. Assume towards a contradiction that this does not hold and $\mu=h^{\Delta w / \Delta e} y^{\Delta w / \Delta e} \neq v$. Since $\mu^{\Delta e}=v^{\Delta e}$ by Equation (7), this must mean that $(\mu / v)^{\Delta e}=1$ and therefore $\mu / v \in \mathbb{G}_{2}$ is an element of order $\Delta e>1$. Since $\Delta e$ is easy to compute and $\mu / v$ is a non-identity element of $\mathbb{G}_{2}$, this contradicts the assumption that $\mathbb{G}_{2}$ is a generic group (specifically, it contradicts non-trivial order hardness [BBF19, Corollary 2]). We thus conclude that our extractor successfully recovers the witnesses $r$ and $s$.

We still need to verify that the $r^{*}$ we can extract from $u$ will be consistent with the one extracted from $v$, i.e., $r^{*}=r$. Again we know

$$
\begin{aligned}
g^{w} & =u^{e} B \\
& =g^{r^{*} e+\alpha^{*}}
\end{aligned}
$$

$$
\begin{aligned}
g^{w^{\prime}} & =u^{e^{\prime}} B \\
& =g^{r^{*} e^{\prime}+\alpha^{*}}
\end{aligned}
$$

so by a similar argument $r^{*}=\Delta w / \Delta e$, which equals $r$. Thus the protocol satisfies special soundness.
To prove HVZK, we give a simulator which produces an accepting transcript ( $\tilde{A}, \tilde{B}, \tilde{e}, \tilde{w}, \tilde{x})$ that is perfectly indistinguishable from an honest transcript $(A, B, e, w, x)$. The simulator is quite simple: it samples $\tilde{e}{\underset{\sim}{R}}_{\leftarrow}^{R}\left[2^{\lambda}\right]$ identically to an honest verifier, then samples $\tilde{w}, \tilde{x}{\underset{R}{R}}_{\leftarrow}^{\mathbb{Z}}$ and sets $\tilde{A}:=h^{\tilde{w}} y^{\tilde{x}} v^{-\tilde{e}}$ and $\tilde{B}:=g^{\tilde{w}} u^{-\tilde{e}}$. It follows by inspection that the transcript is an accepting one. Furthermore, notice that $\tilde{A}$ and $\tilde{B}$ are uniformly distributed in $\mathbb{G}_{2}$ and $\mathbb{G}_{1}$, respectively, just like $A, B$ in the honest transcript. Also, both $\tilde{x}$ and $x$ are uniform in $\mathbb{Z}$. Thus the simulated transcript is perfectly indistinguishable from an honest one.

Theorem 3 (zk-PoKSqS). The protocol zk-PoKSqS in Appendix C.2 is a special sound and HVZK proof system in the generic group model.
Proof. For special soundness, we show that given two distinct accepting transcripts with the same first message, i.e., $\left(A_{1}, A_{2}, e, w_{1}, w_{2}, x\right)$ and $\left(A_{1}, A_{2}, e^{\prime}, w_{1}^{\prime}, w_{2}^{\prime}, x^{\prime}\right)$ where $e \neq e^{\prime}$, we can extract the witnesses $r_{1}, r_{2}$, $s$. Notice that $v_{2}$ is not guaranteed to encode the square of $s_{1}$, so $v_{2}=h^{r_{2}-r_{1} s_{2} / s_{1}} v_{1}^{s_{2} / s_{1}}$. Let $\sigma_{2}=s_{2} / s_{1}$ and $\rho_{2}:=r_{2}-r_{1} s_{2} / s_{1}=$ $r_{2}-r_{2} \sigma_{2}$.

Using the same extractor as in the proof of Theorem 2, we can extract correct integers $r_{1}=\Delta w_{1} / \Delta e, s_{1}=$ $\Delta x / \Delta e, \rho_{2}=\Delta w_{2} / \Delta e$, and $\sigma_{2}=\Delta x / \Delta e$. Notice $s_{1}=\sigma_{2}$, which implies $\sigma_{2}=s_{1}^{2}$. Finally we use $r_{1}, s_{1}, \rho_{2} \in \mathbb{Z}$ to recover $r_{2}:=\rho_{2}+r_{1} s_{1} \in \mathbb{Z}$. Thus the protocol is special sound.

To prove HVZK, we give a simulator which produces an accepting transcript $\left(\tilde{A}_{1}, \tilde{A}_{2}, \tilde{e}, \tilde{w}_{1}, \tilde{w}_{2}, \tilde{x}\right)$ that is perfectly indistinguishable from an honest transcript $\left(A_{1}, A_{2}, e, w_{1}, w_{2}, x\right)$. The simulator is quite simple: it samples $\tilde{e}{ }_{\leftarrow}^{R}\left[2^{\lambda}\right]$ identically to an honest verifier, then samples $\tilde{w}_{1}, \tilde{w}_{2}, \tilde{x}{ }^{R} \mathbb{Z}$ and sets $\tilde{A}_{1}:=h^{\tilde{w}_{1}} y^{\tilde{x}} v_{1}^{-\tilde{e}}$ and $\tilde{A}_{2}:=h^{\tilde{w}_{2}} v_{1}^{\tilde{x}_{1}} v_{2}^{-\tilde{e}}$. It follows by inspection that the transcript is an accepting one. Furthermore, notice that $\tilde{A}_{1}, \tilde{A}_{2}$ are uniformly distributed in $\mathbb{G}_{2}$, respectively, just like $A_{1}, A_{2}$ in the honest transcript. Also, both $\tilde{w}_{1}, \tilde{w}_{2}, \tilde{x}$ are uniform in $\mathbb{Z}$ just like $w_{1}, w_{2}, x$. Thus the simulated transcript is perfectly indistinguishable from an honest one.

Theorem 4 (zk-PoPS). The protocol zk-PoPS in Appendix C. 2 is sound and HVZK.
Proof. Soundness follows directly from the (knowledge) soundness of zk-PoKSqS and zk-PoSEq as well as Legendre's three-square theorem [Gro05].

For HVZK, note that an honest zk-PoPS transcript has the form $\left(\left\{A_{1, j}, A_{2, j}\right\}_{j \in[3]}, R, e,\left\{w_{1, j}, w_{2, j}, x_{j}\right\}_{j \in[3]}\right)$, where $(R, e, x)$ is an honest zk-PoSEq transcript and ( $\left.A_{1, j}, A_{2, j}, e, w_{1, j}, w_{2, j}, x_{j}\right)$ for $j=1,2,3$ are honest zk-PoKSqS transcripts. Given the instance $v$, our zk-PoPS simulator first computes some random HTLPs $\left(\tilde{u}_{j}, \tilde{v}_{j}\right),\left(\tilde{u}_{j}^{\prime}, \tilde{v}_{j}^{\prime}\right) \stackrel{R}{\leftarrow}$

HTLP.Gen(0) for $j=1,2,3$. These simulated underlying instances are indistinguishable from the honest instances an honest prover would use. This follows from the security of HTLP.

Next, our simulator samples $\tilde{e} \stackrel{R}{\leftarrow}\left[2^{\lambda}\right]$ identically to an honest verifier and uses the simulators of the proof systems, always with the same challenge $\tilde{e}$, to produce a simulated transcript:

$$
\begin{aligned}
\left(\tilde{A}_{1, j}, \tilde{A}_{2, j}, \tilde{e}, \tilde{w}_{1, j}, \tilde{w}_{2, j}, \tilde{x}_{j}\right) & \leftarrow \operatorname{Sim}_{\mathrm{zk}-\operatorname{PoKSqS}}\left(\tilde{v}_{j}, \tilde{v}_{j}^{\prime} ; \tilde{e}\right) \forall j=1,2,3 \\
(\tilde{R}, \tilde{e}, \tilde{x}) & \leftarrow \operatorname{Sim}_{\mathrm{zk}-\operatorname{PoSEq}}\left(\frac{4 \cdot v \boxplus 1}{\tilde{v}_{1}^{\prime} \boxplus \tilde{v}_{2}^{\prime} \boxplus \tilde{v}_{3}^{\prime}} ; \tilde{e}\right)
\end{aligned}
$$

By HVZK of zk-PoKSqS and zk-PoSEq, these transcripts are accepting and indistinguishable from an honestly generated transcript.


[^0]:    *nglaeser@umd.edu. The majority of this work was done at a16z crypto research.
    ${ }^{\dagger}$ seresistvanandras@gmail.com. The majority of this work was done at a16z crypto research.
    ${ }^{\ddagger}$ mzhu@a16z.com
    §jbonneau@gmail.com

[^1]:    ${ }^{1}$ Open-sourced at https://github.com/a16z/cicada.

[^2]:    ${ }^{2}$ We can estimate gas costs for approval voting using the cost of binary voting, as the former uses a disjunction of $m$ copies of the same NIZK and thus scales linearly.

[^3]:    ${ }^{3}$ In the exponential ElGamal case, $h^{\prime}=h$, while in the Paillier construction, $h^{\prime}=h^{N}$ (see Appendix A.2). We will drop the tickmark on $h^{\prime}$ in the remainder of this section to avoid notational clutter.

[^4]:    ${ }^{4}$ For space and clarity we drop the moduli and assume that we are working in the appropriate ring in each coordinate (namely $\mathbb{Z}_{N}$ and $\mathbb{Z}_{N^{2}}$, respectively).

[^5]:    ${ }^{5}$ We make this stricter requirement to simplify the norm check. Note that voters should be incentivized to submit such votes, since it maximizes their voting power.

[^6]:    ${ }^{6}$ Assuming $s_{j}^{2}<p_{j}$ for all $j$, which in our case will hold regardless, we set each $p_{j}<n w$ to avoid overflow when adding ballots and $s_{j}^{2} \leq w<n w$.

[^7]:    ${ }^{7}$ The largest KZG CRS we know of [Exp] is for $d=2^{28}$, so in the case of $\mathcal{X}=[0,1]^{m}$ this strategy requires $m \leq 28$.

