# Multiple Secret Leaders

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## 1 Some Notation

1. We will have $n$ parties

2. We will have $k$ leaders elected

3. We will have a "bid" published by a user $i \in [n]$ be denoted as $b_i$

4. We will denote a commitment as $\texttt{comm}_i$

5. We will denote some generic CRHF as $h$

6. We will say $\texttt{Enc}_{\text{TFHE}}$ and $\texttt{Dec}_{\text{TFHE}}$ for TFHE encoding and decoding respectively

## 2 Preliminaries

### 2.1 Threshold FHE

[JRS17, BGG$^+$18] defines threshold FHE encryption. For the sake of completeness, we will define it here.

**Definition 2.1** (TFHE [JRS17])**.** Let $P = \{P_1, ..., P_N\}$ be a set of $N$ parties and $\mathbb{S}$ be a class of access structures on $P$. A TFHE scheme for $\mathbb{S}$ is a tuple of PPT algorithms

$$(\texttt{TFHE.Setup}, \texttt{TFHE.Encrypt}, \texttt{TFHE.Eval}, \texttt{TFHE.PartDec}, \texttt{TFHE.FinDec})$$

such that the following specifications are met

- $(pk, sk_1, ..., sk_N) \leftarrow \texttt{TFHE.Setup}(1^\lambda, 1^s, \mathbb{A})$: Takes as input a security parameter $\lambda$, a depth bound on the circuit, and a structure $\mathbb{A} \in \mathbb{S}$. Outputs a public key $pk$ and a secret key $sk_i$ for each party $P_i$.

- $\texttt{ct} \leftarrow \texttt{TFHE.Encrypt}(pk, \mu)$: Takes as input a public key and a message $\mu \in \{0, 1\}$ and outputs a ciphertext $\texttt{ct}$.

- $\hat{\texttt{ct}} \leftarrow \texttt{TFHE.Eval}(C, \texttt{ct}_1, ..., \texttt{ct}_k)$: Takes as input a circuit $C$ of depth at most $d$ and $k$ ciphertexts $\texttt{ct}_1, ..., \texttt{ct}_k$. Outputs a ciphertext $\hat{\texttt{ct}} = C(\texttt{ct}_1, ..., \texttt{ct}_k)$.

- $p_i \leftarrow \texttt{TFHE.PartDec}(\texttt{ct}, sk_i)$: Takes as input a ciphertext $\texttt{ct}$ and a secret key $sk_i$ and outputs a partial decryption $p_i$.

- $\hat{\mu} \leftarrow \texttt{TFHE.FinDec}(B)$: Takes as input a set $B = \{\, p_i \,\}_{i \in S}$ for some $S \subseteq [N]$ and deterministically outputs a message $\hat{\mu} \in \{\, 0, 1, \perp \,\}$.

Further we remember the definitions of evaluation correctness and simulation security as outlined in, [BEHG20].

**Definition 2.2** (Evaluation Correctness [JRS17]). . We have that $\texttt{TFHE}$ scheme is correct if for all $\lambda$, depth bounds $d$, access structure $\mathbb{A}$, circuit $C : \{\, 0, 1 \,\}^k \to \{\, 0, 1 \,\}$ of depth at most $d$, $S \in \mathbb{A}$, and $\mu_i \in \{\, 0, 1 \,\}$, we have the following. For $(pk, sk_1, ..., sk_N) \leftarrow \texttt{TFHE.Setup}(1^\lambda, 1^d, \mathbb{A})$, $\texttt{ct}_i \leftarrow \texttt{TFHE.Encrypt}(pk, \mu_i)$ for $i \in [k]$, $\hat{\texttt{ct}} \leftarrow \texttt{TFHE.Eval}(pk, C, \texttt{ct}_1, ..., \texttt{ct}_k)$,

$$\mathbf{Pr}\left[\texttt{TFHE.FinDec}(pk, \{\, \texttt{TFHE.PartDec}(pk, \hat{\texttt{ct}}, sk_i)\,\}_{i \in S}) = C(\mu_1, ..., \mu_k)\right] = 1 - \texttt{negl}(\lambda).$$

**Definition 2.3** (Simulation Security [JRS17]). We say that a $\texttt{TFHE}$ scheme is simulation secure if for all $\lambda$, depth bound $d$, and access structure $\mathbb{A}$ if there exists a stateful PPT simulator, $\mathcal{S}$, such that for any PPT adversary $\mathcal{A}$, we have that the experiments $\texttt{Expt}_{\mathcal{A}, \text{Real}}(1^\lambda, 1^d)$ and $\texttt{Expt}_{\mathcal{A}, \text{Sim}}(1^\lambda, 1^d)$ are statisically close as a function of $\lambda$. The experiments are defined as follows:

- $\texttt{Expt}_{\mathcal{A}, \text{Real}}(1^\lambda, 1^d)$:

  1. On input the security parameter $1^\lambda$ and depth bound $d$, the adversary outputs $\mathbb{A} \in \mathbb{S}$.
  2. Run $\texttt{TFHE.Setup}(1^\lambda, 1^d, \mathbb{A})$ to obtain $(pk, sk_1, ..., sk_N)$. The adversary is given $pk$.
  3. The adversary outputs a set $S \subseteq \{\, P_1, ..., P_N \,\}$ such that $S \notin \mathbb{A}$ together with plaintest messages $\mu_1, ..., \mu_k \in \{\, 0, 1 \,\}$. The adversary is handed over $\{sk_i\}_{i \in S}$
  4. For each $\mu_i$, the adversary is given $\texttt{TFHE.Encrypt}(pk, \mu_i) \to \texttt{ct}_i$.
  5. The adversary issues a polynomial number of queries, $(S_i \subseteq \{\, P_1, ..., P_N \,\}, C_i)$. for circuites $C_i : \{\, 0, 1 \,\}^k \to \{\, 0, 1 \,\}$. After each query the adversary receuves for $l \in S_i$ the value

     $$\texttt{TFHE.PartDec}(\texttt{TFHE.Eval}(C_i, \texttt{ct}_1, ..., \texttt{ct}_k), sk_l) \to p_l$$

  6. $\mathcal{A}$ outputs $\texttt{out}$, the experiment's output.

- $\texttt{Expt}_{\mathcal{A}, \text{Sim}}(1^\lambda, 1^d)$:

  1. On input the security parameter $1^\lambda$ and depth bound $d$, the adversary outputs $\mathbb{A} \in \mathbb{S}$.
  2. Run $\texttt{TFHE.Setup}(1^\lambda, 1^d, \mathbb{A})$ to obtain $(pk, sk_1, ..., sk_N)$. The adversary is given $pk$.
  3. $\mathcal{A}$ outputs a set $S^* \subseteq \{\, P_1, ..., P_N \,\}$ such that $S \notin \mathbb{A}$ and plaintexts $\mu_1, ..., \mu_k \in \{\, 0, 1 \,\}$. The simulator is given $pk, \mathbb{A}, S^*$ as input and outputs $\{\, sk_i \,\}_{i \in S^*}$ and the state $\texttt{state}$. The adversary is given $\{sk_i\}_{i \in S^*}$
  4. For each $\mu_i$, the adversay is given $\texttt{TFHE.Encrypt}(pk, \mu_i) \to \texttt{ct}_i$.
  5. $\mathcal{A}$ issues a polynomial number of queries of the form $(S_i \subseteq \{\, P_1, ..., P_N \,\}, C_i)$
  6. for circuits $C_i : \{\, 0, 1 \,\}^k \to \{\, 0, 1 \,\}$. After each query, the simulator computes

     $$\texttt{Sim}_{\text{TFHE}}(C_i, \{\, \texttt{ct}_l \,\}_{l=1}^k, C_i(\mu_1, ..., \mu_k), \texttt{state}) \to \{\, p_l \,\}_{l \in S_i}$$

     and sends $\{\, p_l \,\}_{l \in S_i}$ to the adversary.
  7. $\mathcal{A}$ outputs $\texttt{out}$, the experiment's output.

## 2.2 Data Independent Priority Queue

In this work, we will use data independent queues as studied in [Tof11, MZ14, MDPB23]. Data independent data structures are unique as their control flow and memory access do not depend on input data ([MZ14]).

**Definition 2.4** (Word RAM model [MZ14]). In the word RAM model, the RAM has a constant number of public and secret registers and can perform arbitrary operations on a constant number of registers in constant time.

**Definition 2.5** (Data Independent Data Structure [MZ14]). In the word RAM model, a data independent data structure is a collection of algorithms where all the algorithms uses RAM such that the RAM can only set its control flow based on registers that are public.

Data independent queues are especially useful as they allow for efficient computation within MPC and FHE as control flow is not dependent on underlying ciphertexts data. We use a data independent queue as outlined in [MDPB23] which allows for

- `PQ.Insert`: Inserts a tag and value, $(p, x)$ into `PQ` according to the tag's priority.

- `PQ.ExtractFront`: Removes and returns the $(p, y)$ with highest tag priority.

- `PQ.Front`: Returns the $(p, y)$ with highest tag priority without removing the element.

Moreover, we note that the order is stable. I.e. the first inserted among equal tagged elements has a higher priority.

## 2.3 Resevoir Sampling

Resevoir sampling is an online algorithm which allows for randomly selecting $k$ elements from a stream of $n$ elements while using $\tilde{O}(k)$ space. Algorithm R ([Vit85]) is a simple algorithm which relies on a priority queue with interface:

- `Resevoir.Init`$(k)$ initialize the resevoir sampling algorithm and data structure

- `Resevoir.Insert`$(\mu_i, e_i, \text{coin}_i)$ where $\mu_i$ is $i$-th item, $e_i$ is independentally sampled randomness, and $\text{coin}_i$ is a random coin with probability $1/m$ of equaling 1.

  - If $i \leq k$, insert the item into the queue along with $e_i$ as its tag via `PQ.Insert`$(e_i, \mu_i)$.
  - If $i > k$ and $\text{coin}_i = 1$, replace the smallest labeled item in the queue with the new item if the coin is 1.
  - If $i > k$ and $\text{coin}_i = 0$, do nothing.

- $\mu_{a_1}, \mu_{a_2}, ..., \mu_{a_k} \leftarrow$ `Resevoir.Output`$()$ where $a_1, ..., a_k$ are a uniformly random ordered susbset of $[n]$

  - Call `PQ.ExtractFront` $k$ times setting $\mu_{a_\ell}$ to the $\ell$-th call to `PQ.ExtractFront` where $\ell \in [k]$.

# 3 TFHE MSLE Protocol

We use a similar notion of ideal functionality for a multi-secret leader election from the ideal functionality of single secret leader election of LS: CITE.

3

> **The MSLE functionality** $\mathcal{F}_{\text{MSLE}}$: Initialize $E, R \leftarrow \emptyset, b \leftarrow 0$. Initialize $S$ to denote the set of sets of active participants in each round. Set $\mathcal{E} \leftarrow \emptyset$ to denote the set of finished elections. Fix some $k \in \mathbb{N}$ to denote the number of rounds. Upon receiving,
>
> - `register` from party $P_i$, set $R \leftarrow R \cup \{(i, n)\}$, broadcast (`register`, $i$) to all parties and set $b \leftarrow b + 1$
>
> - `register_elect`$(eid, w)$ from party $P_i$. If $eid \in \mathcal{E}$ send $\bot$ to $P_i$ and do nothing. If $(i, w) \notin R$ or $(i, w) \in S_{eid}$, send $\bot$ to $P_i$ and do nothing. If $S_{eid}$ is not defined, set $S_{eid} \leftarrow \{(i, w)\}$. Otherwise, set $S_{eid} \leftarrow S_{eid} \cup \{(i, w)\}$.
>
> - `elect`$(eid)$ Elect $k$ leaders from $S_{eid} \subseteq R$ parties. If $|S| \geq k$ and $eid \notin \mathcal{E}$, randomly sample $W^{eid} \subseteq S_{eid}$ where $|W^{eid}| = k$. Then, assign a random ordering to $W^{eid}$ to get ordered set $E^{eid}$. Next, send (`outcome`, $eid, a$) to $P_j$ for all $E_a^{eid} = (j, \cdot)$ and (`outcome`, $eid, \bot$) to $P_i$ if $(i, \cdot) \notin E^{eid}$. Store $E \leftarrow E \bigcup \{E^{eid}\}$. Set $\mathcal{E} \leftarrow \mathcal{E} \cup \{eid\}$.
>
> - `reveal` from $P_i$: for $E_{eid} \in E$, if $i = E_\ell^{eid}$, broadcast (`result`, $eid, \ell, i$). Otherwise, broadcast (`rejected`, $eid, \ell, i$).

Figure 1: Description of the MSLE functionality, heavily based on the description of SSLE in LS: CITE Dario and CFG21

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## 3.1 Semi Honest Simulation Security

We can show semi-honest simulation security by showing that the view of each party $i$ in the real protocol can be simulated throughout the course of one election and then that this simulation can be extended for a polynomial number of elections.

Let $\overline{n}$ be the total number of calls to `register_elect`$(eid, ., .)$ before the election for $eid$, `elect`$(eid)$ is called and that $k \leq \overline{n} \leq n$ as if $\overline{n} < k$, then `elect` returns $\bot$ and is trivial to simulate. Further, let $\overline{k}$ be the total number of calls to `reveal`$(eid, ., .)$ which did not reject, again we have that $\overline{k} \leq k$. We will now show that a simulator can simulate the view of each party $i$ after $\overline{n}$ calls to `register_elect`$(eid, .)$, a call to `elect`$(eid)$, and $\overline{k}$ calls to `reveal`$(eid, .)$ for a fixed $eid$.

We will now show that $\text{Sim}_i$ is indeed a simulator for the view of $\pi_{\text{MSLE}}$ for `register_elect`, `elect`, and `reveal`.

**Lemma 3.1.** *[`register_elect` is simulation secure]*

*Proof.* The simulator gets as input party $i$'s secret value, $s_i$, party $i$'s TFHE share $sk_i$, $eid$, and ticket number $w$. We note that if $eid \in \mathcal{E}$ or $(i, w) \notin R$, then the simulator can simply output $\bot$ and is identical to the real protocol. Otherwise, if party $P_i$ calls `register_elect`, then the simulator knows the input of $P_i$ and can simulate the protocol honestly. If party $P_j$ call `register_elect` for some $j \neq i$, then the view of the protocol is that of $(\text{Enc}_{\text{TFHE}}(c_j), \text{Enc}_{\text{TFHE}}(e_i, \text{coin}_i), \text{Resevoir}^{eid}.\text{Insert}(\text{Enc}_{\text{TFHE}}(c_j, e_i, \text{coin}_j)$. Note that this view is completely determined by $\text{Enc}_{\text{TFHE}}(c_j)$. Also, note that $c_j$ is drawn from a random distribution and is not in the view of the real protocol. Thus, by semantic security of TFHE (TODO: add citation and refrence to prelis) we have that $\text{Enc}_{\text{TFHE}}(c_j) \overset{c}{\equiv} \text{Enc}_{\text{TFHE}}(c_j')$ where $c_j'$ is a commitment to a random value. $\square$

**Lemma 3.2** (`elect` is simulation secure). *Proof.* If the view of the real protocol is $\bot$ because $eid$ was already called, then the simulator can simply output $\bot$ and is thus identical to the real protocol.

4

**The MSLE Protocol** $\pi_{\text{MSLE}}$: Initialize $b = 0$. Fix some $k \in \mathbb{N}$ to denote the number of rounds. Initialize an empty set of tickets, $R$. Initialize an empty lookup of sets of parties in each election, $S$. Initialize an empty lookup of reservoir sampling data structures $\mathcal{R}$ and a set of finished elections $\mathcal{E}$ Initialize an empty lookup of election results, $E$.

Initialize $S \leftarrow \emptyset$ to denote the set of sets of active participants in each round.

- `initialize`

    - Set $n = 0$
    - Sample a random `TFHE` secret key, public key pair $sk, pk$ and publish $pk$.
    - Sample some secret $s_{\text{TFHE}}$ and publish $\text{Enc}_{\text{TFHE}}(s_{\text{TFHE}})$. This will be the key to the PRF

- `register` from party $P_i$

    - If party $P_i$ does not already have a TFHE share, create a TFHE share, $sk_i$, for $P_i$ and send the share over a secure channel to $P_i$.
    - $R \leftarrow R \cup \{(i, b)\}$, set $b \leftarrow b + 1$.

- `register_elect`$(eid, \text{Enc}_{\text{TFHE}}(c_i), w)$ from party $P_i$ where $c_i = \text{comm}(s_i)$ for a randomly sampled secret $s_i$.

    - If $eid \in \mathcal{E}$, then send $\perp$ to $P_i$ and do nothing.
    - If $(i, w) \in S_{eid}$ or $(i, w) \notin R$, send $\perp$ and do nothing.
    - Otherwise, if $\mathcal{R}_{eid} \notin \mathcal{R}$, $\mathcal{R}_{eid} \leftarrow \text{Reservoir.Init}(k)$
    - The CRS will be used to run a PRF to get $\text{Enc}_{\text{TFHE}}(e_i), \text{Enc}_{\text{TFHE}}(\text{coin}_i) = \text{Enc}_{\text{TFHE}}(\text{PRF}(c_i, s_{\text{TFHE}}))$ for $i \in S$
    - $\text{Enc}_{\text{TFHE}}(c_i)$ will be fed to the encrypted streaming sampler along with randomness via $\text{Reservoir}^{eid}.\text{Insert}(\text{Enc}_{\text{TFHE}}(c_i), \text{Enc}_{\text{TFHE}}(e_i), \text{Enc}_{\text{TFHE}}(\text{coin}_i))$.

- `elect`$(eid)$

    - If $eid \in \mathcal{E}$, then return $\perp$ and do nothing.
    - The encrypted streaming sampler will output a list of $k$ messages via calling $\text{Reservoir}^{eid}.\text{Output}()$ $k$ times: $\text{Enc}_{\text{TFHE}}(c_{a_1}), \text{Enc}_{\text{TFHE}}(c_{a_2}), ..., \text{Enc}_{\text{TFHE}}(c_{a_k})$.
    - Then, at least $t$ parties will submit decryption shares, $p_i = \text{TFHE.PartDec}(\text{Enc}_{\text{TFHE}}(c_{a_1}), ..., \text{Enc}_{\text{TFHE}}(c_{a_2}))$ to get $c_{a_1}, ..., c_{a_k} = \text{TFHE.FinDec}(\{p_i\})$.
    - Add $E_{eid} = \{c_{a_1}, ..., c_{a_k}\}$ to $E$.

- `reveal`$(eid, \ell, \text{Enc}_{\text{TFHE}}(c_i'))$ from $P_i$

    - $P_i$ submits a proof that they know the opening to $c_{a_\ell}$. If this proof verifies, send out $(\text{result}, eid, \ell, i)$ to all parties. Otherwise, send out $(\text{rejected}, eid, \ell, i)$ to all parties.

Figure 2: Description of the MSLE protocol

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**Simulator for Threshold MSLE** $\mathtt{Sim}_i$: Initialize $b = 0$. Fix some $k \in \mathbb{N}$ to denote the number of rounds. Initialize an empty set of tickets, $R$, an empty lookup of sets of parties in each election, $S$, a set of finished elections $\mathcal{E}$, an empty lookup of election results, $E$, and a set $S \leftarrow \emptyset$ to denote the set of sets of active participants in each round. Moreover, set a random tape for the simulator. The simulator knows, input for party $P_i$, $sk_i$ and $s_i$.

- $\mathtt{register}$ from party $P_j$

  - $R \leftarrow R \cup \{(i, b)\}$, set $b \leftarrow b + 1$.
  - Simulate the secure channel communication with party $P_j$ if $i \neq j$.
  - Run $\mathtt{register}$ honestly if $i = j$ by sending $sk_i$ to $P_i$

- $\mathtt{register\_elect}(eid, w, s_i, sk_i)$ from party $P_j$.

  - If $j \neq i$, the simulator samples a random value $s'_j$ and follows the protocol directly using $s'_{\mathsf{TFHE}}$ and $\mathtt{Enc}_{\mathrm{TFHE}}(c'_j)$ where $c'_j = \mathtt{comm}(s'_j)$. Store $c'_j$ in a lookup table as well as its committed message.
  - If $j = i$, the simulator will use the commitment $c_i = \mathtt{comm}(s_i)$. And run $\mathtt{register\_elect}$ as is in the protocol

- $\mathtt{elect}(eid, \mathtt{out}, s_i, sk_i)$ where the $\mathtt{out}$ is output $\bot$ or $(\mathtt{outcome}, eid, q)_i$ for all $i \in [n]$ where $q \in \{1, ..., k, \bot\}$.

  - Let $\bar{n}$ be the total number of successful calls to $\mathtt{register\_elect}(eid, ., .)$ before the election for $eid$
  - If the output is $\bot$, return $\bot$.
  - Let $a_1, ..., a_k$ be the ordered set of parties that won the election. I.e. if $q_i = \ell$ then $a_\ell = i$.
  - The simulator then gives $\mathtt{Sim}_{\mathrm{TFHE}}(C, \{\mathtt{Enc}_{\mathrm{TFHE}}(c'_j)\}_{j \in [\bar{n}]}, c'_1, ..., c'_{a_\ell}, S, \mathtt{st})$ to the TFHE simulator to get a list of partial decryptions, $p_1, ..., p_{t-1}$ where $S$ is a qualified set and $C$ is the reservoir sampling circuit with PRF seed $s_{\mathsf{TFHE}}$ hardcoded. Note that this sets the decryption of the output of the TFHE circuit sampling to $c'_{a_\ell}$ for $\ell \in [k]$.
  - Add $E_{eid} = \{c'_{a_1}, ..., c'_{a_k}\}$ to $E$.

- $\mathtt{reveal}(eid, \ell, \mathtt{Enc}_{\mathrm{TFHE}}(c'_j))$ from $P_j$ and output $\bot$ or $(\mathtt{result}, eid, \ell, j)$.

  - As the simulator has knowledge of the openings to all of the commitments $c'_j$ used, the simulator to honestly run $\mathtt{reveal}(eid, \ell, \mathtt{Enc}_{\mathrm{TFHE}}(c'_j))$ with commitment $c'_j$ and opening $s'_j$.
  - Note that in the semi-honest setting, the output is never $\bot$

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Figure 3: Description of the MSLE protocol

Otherwise, note that the simulator needs to "fix" the output of `elect` to yield a list of commitments such that, if $a_\ell = j$ if party $j$ wins election $\ell$. Thus, the simulator can simply output the decryption shares $\mathrm{Sim}_{\mathrm{TFHE}}(C, \{\mathrm{Enc}_{\mathrm{TFHE}} c_j'\}_{j \in [\overline{n}]}, c_1', ..., c_{a_\ell}', S, \mathtt{st})$. Note that the reservoir sampling circuit is indeed simulated by $\mathrm{Sim}_{\mathrm{TFHE}}$ and the decryption shares are simulated as well such that the cipher texts decrypt to $c_{a_1}', ..., c_{a_k}' \stackrel{\mathrm{c}}{\equiv} c_{a_1}, ..., c_{a_k}$ by lemma 3.1. $\qquad\square$

**Lemma 3.3** (`reveal` is simulation secure)**.** *Proof.* Note that the simulator can simply run `reveal` honestly as the simulator has knowledge of the openings to all of the commitments $c_j'$ used and is thus identical to the view of the real protocol. $\qquad\square$

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