## Finding a Nash Equilibrium Is No Easier Than Breaking Fiat-Shamir

Arka Rai Choudhuri, Pavel Hubacek, Chethan Kamath, Krzysztof Pietrzak, Alon Rosen, Guy N. Rothblum

Presented by Jiaqian Li, Kashvi Gupta, adapted from Guy Rothblum's slides March 21, 2024

Columbia University

Recap

## Last lecture, we saw

Cryptographic hardness in PPAD $\cap$ PLS:

- "supper strong" iOWF + "supper strong" $\mathrm{iO} \Longrightarrow$ SVL hard
- OWP $+\mathrm{iO} \Longrightarrow$ SVL hard


## Last lecture, we saw

Cryptographic hardness in PPAD $\cap$ PLS:

- "supper strong" iOWF + "supper strong" iO $\Longrightarrow$ SVL hard
- OWP $+\mathrm{iO} \Longrightarrow$ SVL hard

In fact, the reduction in the latter work can also work with keyed iOWF (instead of OWP), and (as we will hopefully see later in the class) [BPW] showed $\mathrm{iO}+$ OWF implies keyed iOWF, so overall we can get:

$$
\mathrm{OWF}+\mathrm{iO} \Longrightarrow \mathrm{SVL} \text { hard }
$$

However, the notion of iO still lies within the domain of speculation: many candidate schemes have been broken, and surviving ones are yet to undergo extensive evaluation.

## The Sink-of-Verifiable-Line Problem

## Definition (Sink-of-Verifiable-Line, SVL)

A Sink-of-Verifiable-Line instance ( $S, V, T, v_{0}$ ) consists of

- $T \in\left\{1,2, \ldots, 2^{M}\right\}$,
- $v_{0} \in\{0,1\}^{M}$,
- $S:\{0,1\}^{M} \rightarrow\{0,1\}^{M}$,
- $V:\{0,1\}^{M} \times\{1,2, \ldots, T\} \rightarrow\{0,1\}$
with the guarantee that $V(v, i)=1$ if and only if $v=S^{i}\left(v_{0}\right)$.
The goal is to find a vertex $v$ such that $V(v, T)=1$ (i.e., the sink).


## The Sink-of-Verifiable-Line Problem

## Definition (Sink-of-Verifiable-Line, SVL)

A Sink-of-Verifiable-Line instance ( $S, V, T, v_{0}$ ) consists of

- $T \in\left\{1,2, \ldots, 2^{M}\right\}$,
- $v_{0} \in\{0,1\}^{M}$,
- $S:\{0,1\}^{M} \rightarrow\{0,1\}^{M}$,
- $V:\{0,1\}^{M} \times\{1,2, \ldots, T\} \rightarrow\{0,1\}$
with the guarantee that $V(v, i)=1$ if and only if $v=S^{i}\left(v_{0}\right)$.
The goal is to find a vertex $v$ such that $V(v, T)=1$ (i.e., the sink).


## Lemma

SVL is reducible to UEOPL (Unique-End-of-Potential-Line, which is known to lie in PPAD $\cap$ PLS, but not known to be complete).

## The Sink-of-Verifiable-Line Problem

Definition (relaxed-Sink-of-Verifiable-Line, rSVL)
A relaxed-Sink-of-Verifiable-Line instance $\left(S, V, T, v_{0}\right)$ consists of

- $V:\{0,1\}^{M} \times\{1,2, \ldots, T\} \rightarrow\{0,1\}$
with the guarantee that for every $(v, i)$ such that $v=S^{i}\left(v_{0}\right), V(v, i)=1$.
The goal is to find one of the following:
(i) The sink: a vertex $v$ such that $V(v, T)=1$, or
(ii) False positive: a pair $(v, i)$ such that $v \neq S^{i}\left(v_{0}\right)$ and $V(v, i)=1$.


## The Sink-of-Verifiable-Line Problem

## Definition (relaxed-Sink-of-Verifiable-Line, rSVL)

A relaxed-Sink-of-Verifiable-Line instance $\left(S, V, T, v_{0}\right)$ consists of

- ...
- $V:\{0,1\}^{M} \times\{1,2, \ldots, T\} \rightarrow\{0,1\}$
with the guarantee that for every $(v, i)$ such that $v=S^{i}\left(v_{0}\right), V(v, i)=1$.
The goal is to find one of the following:
(i) The sink: a vertex $v$ such that $V(v, T)=1$, or
(ii) False positive: a pair $(v, i)$ such that $v \neq S^{i}\left(v_{0}\right)$ and $V(v, i)=1$.

New Lemma
$r S V L$ is also reducible to UEOPL.

## Today, we will see

Cryptographic hardness of rSVL - and therefore of PPAD $\cap$ PLS - based on

- hardness of counting \# of satisfying assignments of a boolean formula (\#SAT), and
- soundness of Fiat-Shamir transformation applying to some interactive protocol (the sumcheck protocol)

Preliminaries: IP, the sumcheck protocol

## Unambiguous IPs

$P(x)$


An interactive protocol $(\mathrm{P}, \mathrm{V})$ is a $\delta$-sound interactive proof (IP) for $L$ if:

- Completeness: For every $x \in L$, if $V$ interacts with $P$ on common input $x$, then $V$ accepts with probability 1.
- Soundness: For every $x \notin L$ and every (computationally unbounded) cheating prover strategy $\widetilde{P}$, the verier $V$ accepts when interacting with $\widetilde{P}$ with probability less than $\delta(|x|)$ for some function $\delta$.


## Unambiguous IPs

An interactive protocol $(\mathrm{P}, \mathrm{V})$ is a $\delta$-sound interactive proof (IP) for $L$ if:

- Completeness: For every $x \in L$, if $V$ interacts with $P$ on common input $x$, then $V$ accepts with probability 1.
- Soundness: For every $x \notin L$ and every (computationally unbounded) cheating prover strategy $\widetilde{P}$, the verier $V$ accepts when interacting with $\widetilde{P}$ with probability less than $\delta(|x|)$ for some function $\delta$.


## Remark

$\mathrm{NP} \subseteq \mathrm{IP}$ as the prover can send the certificate to the verifier in one round.
In fact, $\mathrm{IP}=\mathrm{PSPACE}$, where PSPACE contains all languages that can be computed by a program (Turing machine) using polynomial space.

## Unambiguous IPs

An interactive protocol ( $\mathrm{P}, \mathrm{V}$ ) is a $(\epsilon, \delta)$-unambiguosly sound interactive proof (IP) for $L$ if:

- Prescribed Completeness: For every $x \in\{0,1\}^{*}$, if $V$ interacts with $P$ on common input $x$, then $V$ outputs $L(x)$ with probability 1 .
- Soundness: For every $x \notin L$ and every (computationally unbounded) cheating prover strategy $\widetilde{P}$, the verier $V$ accepts when interacting with $\widetilde{P}$ with probability less than $\delta(|x|)$ for some function $\delta$.
- Unambiguity: For every $x \in L$ and every (computationally unbounded) cheating prover strategy $\widetilde{P}$, if $\widetilde{P}$ deviates from $P$ at some point, then at the end of the protocol $V$ accepts with probability at most $\epsilon(|x|)$.


## Unambiguous IPs

An interactive protocol $(\mathrm{P}, \mathrm{V})$ is a $(\epsilon, \delta)$-unambiguosly sound interactive proof (IP) for $L$ if:

- Prescribed Completeness: For every $x \in\{0,1\}^{*}$, if $V$ interacts with $P$ on common input $x$, then $V$ outputs $L(x)$ with probability 1 .
- Soundness: For every $x \notin L$ and every (computationally unbounded) cheating prover strategy $\widetilde{P}$, the verier $V$ accepts when interacting with $\widetilde{P}$ with probability less than $\delta(|x|)$ for some function $\delta$.
- Unambiguity: For every $x \in L$ and every (computationally unbounded) cheating prover strategy $\widetilde{P}$, if $\widetilde{P}$ deviates from $P$ at some point, then at the end of the protocol $V$ accepts with probability at most $\epsilon(|x|)$.


## Remark

Unambiguous IP is more restrictive than IP. But in particular it will be good enough for an important problem...

## Interactive Sumcheck Protocol

- Fix a finite field $\mathbb{F}$ and a subset $\mathbb{H} \subseteq \mathbb{F}$ (usually $\mathbb{H}=\{0,1\}$ ).
- The (not necessarily effcient) prover takes as input an $n$-variate low-degree polynomial $f: \mathbb{F}^{n} \rightarrow \mathbb{F}$.
- Degree at most $d$ in each variable; think of $d$ as a constant, significantly smaller than $|\mathbb{F}|$
- The verifier only has oracle access to $f$, and is given the constant $y=f(\mathbf{z}) \in \mathbb{F}$ for an oracle query $\mathbf{z} \in \mathbb{F}^{n}$. Each single oracle query runs in time $\operatorname{poly}(n, d, \log (|\mathbb{F}|))$.
- The prover's goal is to convince a verifier that

$$
\sum_{\mathbf{z} \in \mathbb{H}^{n}} f(\mathbf{z})=y
$$

for some value $y \in \mathbb{F}$.

## Interactive Sumcheck Protocol: $\left(P_{S C}(y, f), V_{S C}^{f}(y)\right)$

For $i \leftarrow 1$ to $n$ :
At the beginning of round $i$, both $P_{S C}$ and $V_{S C}$ know $y_{i-1}$ and $\beta_{1}, \ldots, \beta_{i-1} \in \mathbb{F}, y_{0}=y$
(b) $V_{S C}$ receives $d+1$ field elements $\alpha_{i, \gamma}$ and interpolates the (unique)
(a) $P_{S C}$ computes the degree- $d \quad\left\{\alpha_{i, \gamma}=g_{i}(\gamma)\right\}_{\gamma=0}^{d}$ univariate polynomial $g_{i}(x)=\xrightarrow{\left\{a_{i, \gamma} g_{i}(\gamma)\right\}_{\gamma=0}}$ $\sum_{z_{i+1}, \ldots, z_{n} \in \mathbb{H}} f\left(\beta_{1}, \ldots, \beta_{i-1}, x, z_{i+1}, \ldots, z_{n}\right)$
degree- $d$ polynomial $\hat{g}_{i}$ such that $\hat{g}_{i}(\gamma)=\alpha_{i, \gamma}$.
$V_{S C}$ then checks that $\sum_{x \in \mathbb{H}} \hat{g}_{i}(x)=$ $y_{i-1}$. If not, then $V_{S C}$ rejects.
(c) $V_{S C}$ chooses a random element $\beta_{i} \in$ $\mathbb{F}$, sets $y_{i}=g_{i}\left(\beta_{i}\right)$, and sends $\beta_{i}$ to $P_{S C}$.
${ }^{(*)}$ At the last round, $V_{S C}$ uses a single oracle call to $f$ to check that $y_{n}=f\left(\beta_{1}, \ldots, \beta_{n}\right)$

## Interactive Sumcheck Protocol: $\left(P_{S C}(y, f), V_{S C}^{f}(y)\right)$

## Remark

The sumcheck protocol is public-coin (fresh coins chosen at each round). If all randomnesses are in sky at the beginning of time, $P$ could just send one message and get something that is almost NP (except the randomnesses is in the sky).

## Remark

We can extend the sumcheck protocol for instances $f$ with a partial assignment $\left(\beta_{1}, \ldots, \beta_{j}\right)$.

## Interactive Sumcheck Protocol: $\left(P_{S C}(y, f), V_{S C}^{f}(y)\right)$

## Theorem

The sumcheck protocol is a $(d(n-j) /|\mathbb{F}|)$-unambiguously sound interactive proof system for prefixed $L_{S C}$, i.e., given a partial assignment $\left(\beta_{1}, \ldots, \beta_{j}\right)$.

## Interactive Sumcheck Protocol: $\left(P_{S C}(y, f), V_{S C}^{f}(y)\right)$

## Theorem

The sumcheck protocol is a $(d(n-j) /|\mathbb{F}|)$-unambiguously sound interactive proof system for prefixed $L_{S C}$, i.e., given a partial assignment $\left(\beta_{1}, \ldots, \beta_{j}\right)$.

## Theorem

The sumcheck protocol can be used to count/verify the number of satisfying assignments of a SAT formula (\#P-complete, believed to be hard):

SAT formula $\Rightarrow$ 3SAT-4 formula $\Rightarrow$ low-degree polynomial

## Example

How to get low-degree polynomial? Arithmetization!

## Interactive Sumcheck Protocol: $\left(P_{S C}(y, f), V_{S C}^{f}(y)\right)$

## Theorem

The sumcheck protocol is a $(d(n-j) /|\mathbb{F}|)$-unambiguously sound interactive proof system for prefixed $L_{S C}$, i.e., given a partial assignment $\left(\beta_{1}, \ldots, \beta_{j}\right)$.

## Theorem

The sumcheck protocol can be used to count/verify the number of satisfying assignments of a SAT formula (\#P-complete, believed to be hard):

SAT formula $\Rightarrow$ 3SAT-4 formula $\Rightarrow$ low-degree polynomial

## Example

How to get low-degree polynomial? Arithmetization!

$$
\begin{aligned}
& \neg p \Rightarrow(1-p) \quad p_{1} \wedge p_{2} \Rightarrow p_{1} \cdot p_{2} \\
& p_{1} \vee p_{2} \Rightarrow 1-\left(1-p_{1}\right)\left(1-p_{2}\right)
\end{aligned}
$$

## Non-interactive Proof Systems

A non-interactive proof system involves the prover sending a single message to the verifier

To give this proof system additional power, we assume that both prover and verifier have access to a common reference string (CRS):

$$
\begin{array}{r}
\pi \leftarrow P(x, R) \\
V(x, R, \pi)
\end{array}
$$

## Non-interactive Proof Systems

A non-interactive proof system involves the prover sending a single message to the verifier

To give this proof system additional power, we assume that both prover and verifier have access to a common reference string (CRS):

$$
\begin{array}{r}
\pi \leftarrow P(x, R) \\
V(x, R, \pi)
\end{array}
$$

## Remark

A non-interactive proof system is called an argument if the soundness and unambiguity properties hold only against computationally-bounded (i.e., poly(n)) cheating prover strategy $P$.

## Fiat-Shamir Transformation



- Many-message protocol $\Rightarrow$ single-message protocol


## Fiat-Shamir Transformation



- Many-message protocol $\Rightarrow$ single-message protocol
- Big open problem: Is the Fiat-Shamir Transformation sound?
- Hash functions "looks like" random functions; generate "random bits" in a mutually agreed way
- Negative results for some contrived protocols; don't know if the transformation is insecure when applying to a natural protocol


## Applying Fiat-Shamir Transformation to Sumcheck

- We assume the Fiat-Shamir heuristic is unambiguously sound for the sumcheck protocol (this is true relative to a random oracle).
- Main result of this paper: Assuming there exists a hash function for which Fiat-Shamir Transformation of the sumcheck protocol is unambiguously sound and \#SAT is hard, then rSVL is hard.


## Corollary

If you show cryptographic assumption A implies that Fiat-Shamir transformation of the sumcheck protocol is unambiguously sound, then rSVL is hard

## Applying Fiat-Shamir Transformation to Sumcheck

- We assume the Fiat-Shamir heuristic is unambiguously sound for the sumcheck protocol (this is true relative to a random oracle).
- Main result of this paper: Assuming there exists a hash function for which Fiat-Shamir Transformation of the sumcheck protocol is unambiguously sound and \#SAT is hard, then rSVL is hard.


## Corollary

If you show cryptographic assumption A implies that Fiat-Shamir transformation of the sumcheck protocol is unambiguously sound, then rSVL is hard

## Corollary

Relative to a random oracle, if \#SAT is hard, then rSVL is hard.

Proof systems and PPAD

## PSPACE and PPAD (EOL)?



PSPACE computation is a exponential graph, and the solution is a sink...

- Problem 1: finding predecessors
- Problem 2: many solutions


## PSPACE and PPAD (EOL)?



PSPACE computation is a exponential graph, and the solution is a sink...

- Problem 1: finding predecessors
- Problem 2: many solutions

We don't think there is a reduction from a PSPACE-complete problem to PPAD.
Idea: Associate each state with a proof, and a verifier circuit that outputs 1 if the state is a valid state in the line of computation

## Proof systems and PPAD



Add proof that node is on "correct" path of the computation; nodes without proof become self-loops

- Computationally sound proofs suffice
- Need incremental unambiguous (to ensure the unique successor) proofs


## Incrementally Verifiable Computation [Valiant '04]

Long computation (length $L$ ), performed via sequence of polynomial time steps:

- after step $i$, state is $\sigma_{i}=\left(y_{i}, \pi_{i}\right)$, where $\pi_{i}$ is the proof
- step function $S\left(i, \sigma_{i}\right)=\sigma_{i+1}=\left(y_{i+1}, \pi_{i+1}\right)$
- verifier $V$ : Accept/reject given $\left(i, y_{i}, \pi_{i}\right)$

Completeness: $S^{L}\left(1, \sigma_{1}\right)$ gives correct output
Soundness: hard to find accepting ( $i, \widetilde{\sigma}_{i}$ )

## Incrementally Verifiable Computation [Valiant '04]

Long computation (length $L$ ), performed via sequence of polynomial time steps:

- after step $i$, state is $\sigma_{i}=\left(y_{i}, \pi_{i}\right)$, where $\pi_{i}$ is the proof
- step function $S\left(i, \sigma_{i}\right)=\sigma_{i+1}=\left(y_{i+1}, \pi_{i+1}\right)$
- verifier $V$ : Accept/reject given $\left(i, y_{i}, \pi_{i}\right)$

Completeness: $S^{L}\left(1, \sigma_{1}\right)$ gives correct output
Soundness: hard to find accepting ( $i, \widetilde{\sigma}_{i}$ )
Incremental unambiguous verifiable computation procedure for a hard-on-average problem $\Longrightarrow$ hardness-on-average of rSVL

## Incrementally Verifiable Computation [Valiant '04]

Long computation (length $L$ ), performed via sequence of polynomial time steps:

- after step $i$, state is $\sigma_{i}=\left(y_{i}, \pi_{i}\right)$, where $\pi_{i}$ is the proof
- step function $S\left(i, \sigma_{i}\right)=\sigma_{i+1}=\left(y_{i+1}, \pi_{i+1}\right)$
- verifier $V$ : Accept/reject given $\left(i, y_{i}, \pi_{i}\right)$

Completeness: $S^{L}\left(1, \sigma_{1}\right)$ gives correct output
Soundness: hard to find accepting ( $i, \widetilde{\sigma}_{i}$ )
Incremental unambiguous verifiable computation procedure for a hard-on-average problem $\Longrightarrow$ hardness-on-average of rSVL - the adversary has to either find the sink (solve the instance) or some cheating proof (break the soundness).

## The Reduction

## Incrementally Verifiable Counter for Satisfying Assignments



For a SAT formula $\varphi\left(z_{1}, z_{2}, \ldots, z_{n}\right)$, we build a graph such that:

- $y_{i}-\#$ of satisfying assignment $\in\left[0^{n}, i\right]$
- $\pi_{i}$ - proof that $y_{i}$ is correct
- Goal: construct successor and verifier circuits:
$-S\left(i, y_{i}, \pi_{i}\right) \rightarrow\left(y_{i+1}, \pi_{i+1}\right)$
- $V\left(i, y_{i}, \pi_{i}\right)$ accepts if $\pi_{i}$ proves that \# of satisfying assignments $\in[0, i]=$ $y_{i}$


## Incrementally Verifiable Counter for Satisfying Assignments


$\left(1, y_{1}, \pi_{1}\right)$
$\left(i, y_{i}, \pi_{i}\right)$
$\left(2^{n}, y_{2^{n}}, \pi_{2^{n}}\right)$

- Challenge: getting $\pi_{i}$ to be of size poly $(n)$ Solution: use the sumcheck protocol
- Challenge: protocol is interactive

Solution: use Fiat-Shamir transformation

- Challenge: computing $S\left(i, y_{i}, \pi_{i}\right)=\left(y_{i+1}, \pi_{i+1}\right)$

Solution: recursive approach, incremental proof update

## Incrementally Verifiable Counter for Satisfying Assignments

- In particular, given the counts for $\left\{y^{\gamma}\right\}_{\gamma=0}^{d}$ for the $(d+1)$ prefix sums with prefixes $(\beta, \gamma)$ (sums of size $2^{n-j}$ ), computing a proof for the count $y=\left(y_{0}+y_{1}\right)$ of the sum with prefix $\beta$ (a sum of size $2^{n-j+1}$ ) reduces to computing a single additional prefix sum of size $2^{n-j}$ (by the sumcheck protocol).


## Incrementally Verifiable Counter for Satisfying Assignments

- In particular, given the counts for $\left\{y^{\gamma}\right\}_{\gamma=0}^{d}$ for the $(d+1)$ prefix sums with prefixes $(\beta, \gamma)$ (sums of size $2^{n-j}$ ), computing a proof for the count $y=\left(y_{0}+y_{1}\right)$ of the sum with prefix $\beta$ (a sum of size $2^{n-j+1}$ ) reduces to computing a single additional prefix sum of size $2^{n-j}$ (by the sumcheck protocol).
- Then, can merge the $(d+2)$ proofs into one by the sumcheck protocol.


## Incrementally Verifiable Counter for Satisfying Assignments

- In particular, given the counts for $\left\{y^{\gamma}\right\}_{\gamma=0}^{d}$ for the $(d+1)$ prefix sums with prefixes $(\beta, \gamma)$ (sums of size $2^{n-j}$ ), computing a proof for the count $y=\left(y_{0}+y_{1}\right)$ of the sum with prefix $\beta$ (a sum of size $2^{n-j+1}$ ) reduces to computing a single additional prefix sum of size $2^{n-j}$ (by the sumcheck protocol).
- Then, can merge the $(d+2)$ proofs into one by the sumcheck protocol.
- Construct the proof recursively, the overall process looks like a depth-first-search.
- The depth of the tree is at most $n$ (at each level, reduce the $\#$ of variables by $1)$; each level contains at most $(d+2)$ proofs.
- Overall, size of the proof at each step is still polynomial.


# Conclusion 

## Takeaways

- If we can build an incremental unambiguous computation procedure for a hard-on-average problem, then rSVL is hard (which implies in turn PPAD $\cap$ PLS is hard).
- Assuming Fiat-Shamir Transformation is unambiguously sound for the sumcheck protocol, we construct such procedure for \#SAT.
- So -

Finding a Nash Equilibrium (a PPAD-complete problem) Is No Easier Than Breaking Fiat-Shamir

Thanks for listening!

