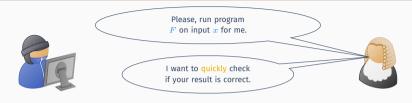
## Efficient Proofs of Computational Integrity from Code-Based Interactive Oracle Proofs

#### Sarah Bordage

Project-team GRACE LIX, Ecole Polytechnique, Institut Polytechnique de Paris Inria Saclay Ile-de-France

> GT GRACE December 8, 2020

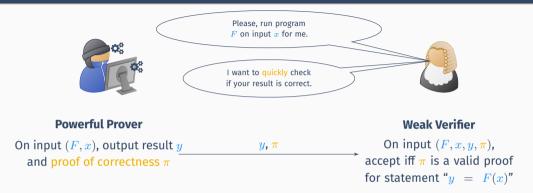
## Motivation: Verifiable Computing



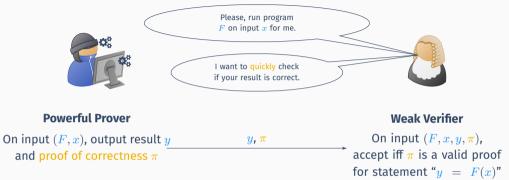
**Powerful Prover** 

## **Weak Verifier**

## Motivation: Verifiable Computing



## Motivation: Verifiable Computing



#### Our wishlist:

#### **Fast verification**

Remark: possible for computations with succinct representation, not for generic circuits,

or with pre-processing (setup phase delegated to a trusted party).

# No trusted setup

## Fast proof generation

**Post-quantum security** 

## A view of the "proofs-space" (by crypto assumptions)

	CRHF	DLOG	KoE/AGM/GGM (pairing-based)	Group of unknown order
2013			Pinocchio [PGHR]	
2014			[BCTV]	
2016	ZKBoo [GM016]	[BCCGP16]	[Groth16]	
	SCI [BBC+]		[GM17]	
2017	Ligero [AHIV]	Bulletproof [BBB+]	(ZK) vSQL [ZGK+]	
		Hyrax [WTS+]		
2018	Stark [BBHR]		VRAM [ZGK+]	
	Aurora [BCR+]			
2019	Fractal [cos]	Spartan [Setty]	<b>Sonic</b> [мвк+]	Supersonic [BFS]
	Succinct Aurora [BCG+]	Halo [BGH]	Plonk [GWC]	
	RedShift [KPV]		Marlin [СНМ+]	
	Virgo [zxzs]		Libra [xzz+]	
2020	Virgo++ [ZWZZ]		Mirage [KKPS]	

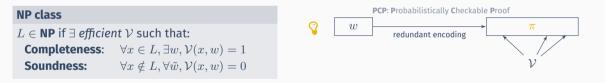
Some implementations of succinct non-interactive arguments for general computations

PCP-based succinct non-interactive arguments

## Starting point: PCP characterization of NP

#### **PCP class**

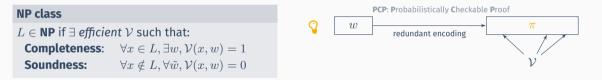
 $L \in \mathsf{PCP}[r, q] \text{ if } \exists \text{ efficient randomized } \mathcal{V} \text{ such that}$   $\begin{array}{l} \mathsf{Completeness:} & \forall x \in L, \exists \pi, \mathcal{V}^{\pi}(x) = 1 \\ \texttt{Soundness:} & \forall x \notin L, \forall \tilde{\pi}, \Pr[\mathcal{V}^{\tilde{\pi}}(x) = 0] > 1/2 \\ \text{where } V \text{ reads } \pi \text{ at } \leq q \text{ locations and tosses} \leq r \text{ coins.} \end{array}$ 



## Starting point: PCP characterization of NP

#### PCP class

```
L \in \mathsf{PCP}[r, q] \text{ if } \exists \text{ efficient randomized } \mathcal{V} \text{ such that}
\begin{array}{l} \mathsf{Completeness:} & \forall x \in L, \exists \pi, \mathcal{V}^{\pi}(x) = 1 \\ \texttt{Soundness:} & \forall x \notin L, \forall \tilde{\pi}, \Pr[\mathcal{V}^{\tilde{\pi}}(x) = 0] > 1/2 \\ \text{where } V \text{ reads } \pi \text{ at } \leq q \text{ locations and tosses} \leq r \text{ coins.} \end{array}
```



PCP Theorem: NP = PCP[log n, O(1)] [BFLS91, FGL\*96, ALMSS'98, AS'98,...]
 Check NP statements way faster than checking an NP witness!
 PCPs are not succinct proofs! PCP generation is too expensive!
 30 years later: practical real-world deployment

Allow interaction with unbounded prover  $\mathcal{P}$  [Goldwasser-Micali-Rackoff'85, Babai'85]

#### **IP class**

 $\begin{array}{ll} L \in \textbf{IP} \text{ if } \exists \mathcal{V} \textit{ efficient randomized such that} \\ \textbf{Completeness:} & \forall x \in L, \exists P, \langle P, V \rangle(x) = 1 \\ \textbf{Soundness:} & \forall x \notin L, \forall \tilde{P}, \Pr[\langle \tilde{P}, V \rangle(x) = 0] > \frac{1}{2} \end{array}$ 



#### Thm: IP = PSPACE [Shamir'86]

## Interactive Proofs (IPs) can be

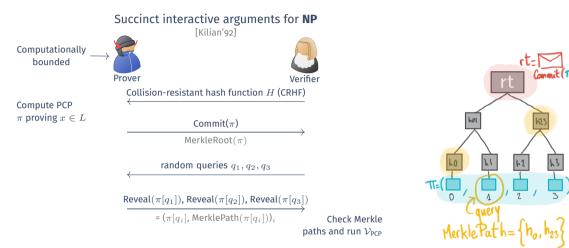
• Zero-knowledge (ZK):  $\mathcal{V}$  learns nothing more than the veracity of the statement.

Assuming the existence of one-way functions, all languages in NP have a ZK proof system. [Goldreich-Micali-Wigderson'91]

 $\bullet$  Public-coin:  ${\cal V}$  uses only public randomness

Public-coin IPs can be made non-interactive in the Random Oracle Model [Fiat-Shamir'86, Pointcheval-Stern'96]

## Succinct interactive arguments from PCPs



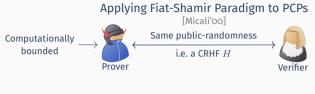
[Kilian'92] First zero-knowledge sublinear argument i.e.  $O(q \log |\pi|)$ 



```
\begin{aligned} & \operatorname{PCP} \pi \ \operatorname{for} x \in L \\ & h_0 = \operatorname{MerkleRoot}(\pi) \\ & \operatorname{Derive queries} q_1, q_2, q_3 \ \operatorname{from} H(h_0) \\ & p_1 = \operatorname{MerklePath}(\pi[q_1]) \\ & p_2 = \operatorname{MerklePath}(\pi[q_2]) \\ & p_3 = \operatorname{MerklePath}(\pi[q_3]) \\ & \pi = (h_0, \pi[q_1], \pi[q_2], \pi[q_3], p_1, p_2, p_3) \end{aligned}
```

- ✓ Non-interactive in the Random Oracle model (→ SNARG)
- ✓ Compatible with: Zero-Knowledge, Proof of Knowledge (→ ZK-SNARK)

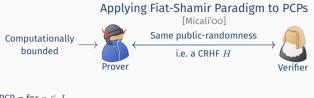
- ✓ Succinct argument
- ✓ One message
- Presumably post-quantum
- ✓ Lightweight crypto
- ✗ PCP generation is too expensive



```
\begin{array}{l} \mathsf{PCP}\ \pi\ \mathsf{for}\ x\in L\\ h_0 = \mathsf{MerkleRoot}(\pi)\\ \mathsf{Derive\ queries\ } q_1, q_2, q_3\ \mathsf{from}\ H(h_0)\\ p_1 = \mathsf{MerklePath}(\pi[q_1])\\ p_2 = \mathsf{MerklePath}(\pi[q_2])\\ p_3 = \mathsf{MerklePath}(\pi[q_3])\\ \hline \pi = (h_0, \pi[q_1], \pi[q_2], \pi[q_3], p_1, p_2, p_3) \end{array}
```

- ✓ Non-interactive in the Random Oracle model (→ SNARG)
- ✓ Compatible with: Zero-Knowledge, Proof of Knowledge (→ ZK-SNARK)

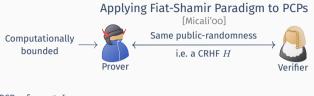
- ✓ Succinct argument
- ✓ One message
- Presumably post-quantum
- ✓ Lightweight crypto
- ✗ PCP generation is too expensive



```
\begin{split} & \mathsf{PCP} \ \pi \ \mathsf{for} \ x \in L \\ & h_0 = \mathsf{MerkleRoot}(\pi) \\ & \mathsf{Derive queries} \ q_1, q_2, q_3 \ \mathsf{from} \ H(h_0) \\ & p_1 = \mathsf{MerklePath}(\pi[q_1]) \\ & p_2 = \mathsf{MerklePath}(\pi[q_2]) \\ & p_3 = \mathsf{MerklePath}(\pi[q_3]) \\ & \underline{\pi = (h_0, \pi[q_1], \pi[q_2], \pi[q_3], p_1, p_2, p_3)} \end{split}
```

- ✓ Non-interactive in the Random Oracle model (→ SNARG)
- ✓ Compatible with: Zero-Knowledge, Proof of Knowledge (→ ZK-SNARK)

- ✓ Succinct argument
- ✓ One message
- Presumably post-quantum
- ✓ Lightweight crypto
- ✗ PCP generation is too expensive

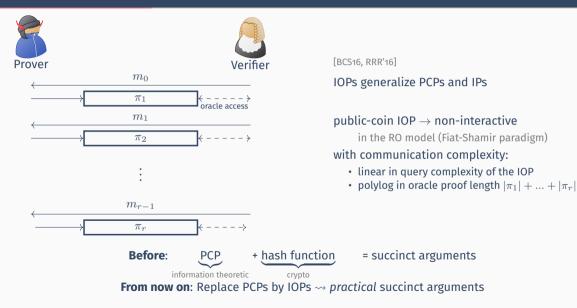


```
\begin{split} & \mathsf{PCP} \ \pi \ \mathsf{for} \ x \in L \\ & h_0 = \mathsf{MerkleRoot}(\pi) \\ & \mathsf{Derive queries} \ q_1, q_2, q_3 \ \mathsf{from} \ H(h_0) \\ & p_1 = \mathsf{MerklePath}(\pi[q_1]) \\ & p_2 = \mathsf{MerklePath}(\pi[q_2]) \\ & p_3 = \mathsf{MerklePath}(\pi[q_3]) \\ & \underline{\pi = (h_0, \pi[q_1], \pi[q_2], \pi[q_3], p_1, p_2, p_3)} \end{split}
```

- ✓ Non-interactive in the Random Oracle model (→ SNARG)
- ✓ Compatible with: Zero-Knowledge, Proof of Knowledge ( $\rightarrow$  ZK-SNARK)

- ✓ Succinct argument
- ✓ One message
- Presumably post-quantum
- ✓ Lightweight crypto
- ✗ PCP generation is too expensive

## IOP Model (Interactive Oracle Proofs)



# From computational integrity to low-degree testing

#### A computational integrity statement

"z is the result of running program F for T steps."

Verification can be **exponentially faster** than naively re-running the computation.

STARK: Scalable Transparent ARgument of Knowledge [BBHR18]

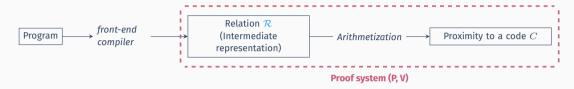
non-interactive argument for bounded halting problems of a Random-Access Machine (RAM)

Over a finite field  $\mathbb{F}$  of cryptographic size:

Setup	Prover	Verifier	Communication complexity	Post-Quantum	
Transparent	$O(T\log^2 T)$	$O(\log^2 T)$	$O(\log^2 T)$	yes	

#### **Applications:**

Allows verification of multiple programs in a single proof (StarkEx, Cairo). One can build PQ signatures from ZK-STARKs (see Ziggy STARK).



constraints of a given computation captured by relation  $\mathcal{R}$   $\rightarrow$  constraints on low-degree polynomials (e.g. vanish on a given set)  $\rightarrow$  low-degree testing

- If  $(x, w) \in \mathcal{R}$ , arithmetization produces  $c \in C$ ,
- If  $(x, w) \notin \mathcal{R}$ , arithmetization produces  $\tilde{c}$  which is **very far** from C.

**Overview of a STARK:** our goal is to construct an IOP  $(\mathcal{P}, \mathcal{V})$  with a polylog verifier, logarithmic query complexity, linear oracle proof length, quasilinear prover.

Let's consider a toy example on a **Collatz sequence**.

Start with any positive integer *u*. Each term is computed from the previous one as follows:

- if the previous term is even, divide it by 2,
- if the previous term is odd, multiply it by 3 and add 1,

**Example**: for u = 42, it gives (42, 21, 64, 32, 16, 8, 4, 2, 1, 4, 2, 1, ...).

Collatz conjecture: for any positive integer *u*, the sequence will always reach 1.

#### **Computational integrity statement:**

"The Collatz sequence that starts with 42, ends with 1 after 8 iterations."

**Collatz sequence:**  $(u_i)$  defined by  $u_0 = u \in \mathbb{N} \setminus \{0\}$  and  $u_{i+1} = \begin{cases} u_i/2 & \text{if } u_i \text{ even,} \\ 3u_i + 1 & \text{if } u_i \text{ odd.} \end{cases}$ 

## Computational integrity statement:

"The Collatz sequence that starts with u = 42 reaches 1 after T = 8 iterations."

## Algebraic Intermediate Representation (AIR)

Take  ${\mathbb F}$  a large enough prime field.

Witness  $w_{\text{AIR}}$  (execution trace):

- array  $(T+1) \times (a+1)$  of elements in  $\mathbb{F}$
- row i: state  $\mathbf{S}[i] = (R_0[i], \dots, R_a[i])$  of the computation at time i
- column j: contents of register  $R_j$  over time

#### **Instance** $x_{AIR}$

- Boundary constraints e.g. input u, output z
- Polynomial constraints
  - $\mathcal{C} \subset \mathbb{F}[\boldsymbol{X}, \boldsymbol{Y}], \mathcal{C} := \{C_0, \dots, C_p\}$
  - $\boldsymbol{X} = (X_0, \dots, X_a) \rightsquigarrow$  current state registers
  - $\boldsymbol{Y} = (Y_0, \dots, Y_a) \rightsquigarrow$  next state registers

#### AIR relation $\mathcal{R}_{\text{AIR}}$

 $(x_{\text{AIR}}, w_{\text{AIR}}) \in \mathcal{R}_{\text{AIR}} \iff \begin{cases} \text{"i} \\ \text{"o} \\ \forall \\ \forall \end{pmatrix}$ 

input is 
$$u''$$
  
foutput is  $z''$   
 $dC \in C, \forall i < T, C(\mathbf{S}[i], \mathbf{S}[i+1]) = 0$ 

(\*) "The Collatz sequence that starts with u = 42, ends with 1 after T = 8 iterations."

Notation: 
$$\boldsymbol{b} := (2^j)_{0 \le j \le 6}$$
,  $\langle \boldsymbol{b}, S[i] \rangle := \sum_{j=0}^a 2^j R_j[i]$  and  $\langle \boldsymbol{b}, \boldsymbol{X} \rangle := \sum_{j=0}^a 2^j X_i^j$ 

Witness  $w_{AIR}$ :  $(T+1) \times (a+1)$  array of elts in  $\mathbb F$ 

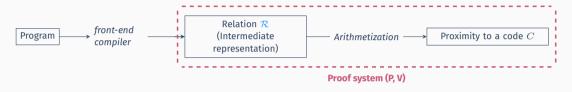
	$R_0$	$R_1$	$R_2$	$R_3$	$R_4$	$R_5$	$R_6$	
i = 0	0	1	0	1	0	1	0	42
i = 1	1	0	1	0	1	0	0	21
i = 2	0	0	0	0	0	0	1	64
i = 3	0	0	0	0	0	1	0	32
i = 4	0	0	0	0	1	0	0	16
i = 5	0	0	0	1	0	0	0	8
i = 6	0	0	1	0	0	0	0	4
i = 7	0	1	0	0	0	0	0	2
i = 8	1	0	0	0	0	0	0	1

Boundary constraints

**Instance**  $x_{AIR}$ :

1.  $\langle b, S[0] \rangle - 42 = 0$  (first term is 42) 2.  $\langle b, S[T] \rangle - 1 = 0$  (last term is 1) Constraints  $C = \{C_0, ..., C_7\} \subset \mathbb{F}[X, Y]$ 3. For  $j = 0, ..., 6, C_j(X, Y) = X_j^2 - X_j$ 4.  $C_7(X, Y) = (1 - X_0) (\langle b, X \rangle - 2 \langle b, Y \rangle) + X_0 (3 \langle b, X \rangle + 1 - \langle b, Y \rangle)$ 

$$(x_{\text{AIR}}, w_{\text{AIR}}) \in \mathcal{R}_{\text{AIR}} \iff \begin{cases} \langle \boldsymbol{b}, S[0] \rangle - 42 = 0\\ \langle \boldsymbol{b}, S[T] \rangle - 1 = 0\\ \forall C_k \in \mathcal{C}, \forall i < T, \ C_k(\mathbf{S}[i], \mathbf{S}[i+1]) = 0 \end{cases}$$



- $\checkmark$  constraints of a given computation captured by relation  $\mathcal{R}$ 
  - $\rightarrow$  constraints on low-degree polynomials (e.g. vanish on a given set)
    - $\rightarrow$  low-degree testing
  - If  $(x, w) \in \mathcal{R}$ , arithmetization produces  $c \in C$ ,
  - If  $(x, w) \notin \mathcal{R}$ , arithmetization produces  $\tilde{c}$  which is **very far** from C.

Assume it exists  $g \in \mathbb{F}^{\times}$  of order T + 1,  $G := \langle g \rangle$ . Let  $D \subset \mathbb{F}$  such that  $D \cap G = \emptyset$  and  $\rho |D| = T$ .

 $\rho \in (0,1)$ 

Reed-Solomon code of dim.  $k : \mathsf{RS}[\mathbb{F}, D, k] := \{P|_D : D \to \mathbb{F} \mid P \in \mathbb{F}[X], \deg P < k\}.$ 

**Encoding the trace (prover's side)** For *j* from 0 to *a*:

- 1. Interpolate  $P_j(X)$  of degree  $\leq T$  such that  $P_j(g^i) = R_j[i]$
- 2. Evaluate  $P_j(X)$  on D.

	$R_0$	$R_1$	$R_2$	$R_3$	$R_4$	$R_5$	$R_6$	
i = 0	0	1	0	1	0	1	0	42
i = 1	1	0	1	0	1	0	0	21
i = 2	0	0	0	0	0	0	1	64
i = 3	0	0	0	0	0	1	0	32
i = 4	0	0	0	0	1	0	0	16
i = 5	0	0	0	1	0	0	0	8
i = 6	0	0	1	0	0	0	0	4
i = 7	0	1	0	0	0	0	0	2
i = 8	1	0	0	0	0	0	0	1

Assume it exists  $g \in \mathbb{F}^{\times}$  of order T + 1,  $G := \langle g \rangle$ . Let  $D \subset \mathbb{F}$  such that  $D \cap G = \emptyset$  and  $\rho |D| = T$ .  $\rho \in (0, 1)$ 

Reed-Solomon code of dim.  $k : \mathsf{RS}[\mathbb{F}, D, k] := \{P|_D : D \to \mathbb{F} \mid P \in \mathbb{F}[X], \deg P < k\}.$ 

**Encoding the trace (prover's side)** For j from 0 to a:

- 1. Interpolate  $P_j(X)$  of degree  $\leq T$  such that  $P_j(g^i) = R_j[i]$
- 2. Evaluate  $P_j(X)$  on D.

	$P_0$	$P_1$	$P_2$	$P_3$	$P_4$	$P_5$	$P_6$	
$g^0$	0	1	0	1	0	1	0	42
$g^1$	1	0	1	0	1	0	0	21
$g^2$	0	0	0	0	0	0	1	64
$g^3$	0	0	0	0	0	1	0	32
$g^4$	0	0	0	0	1	0	0	16
$g^5$	0	0	0	1	0	0	0	8
$g^6$	0	0	1	0	0	0	0	4
$g^7$	0	1	0	0	0	0	0	2
$g^8$	1	0	0	0	0	0	0	1

Assume it exists  $g \in \mathbb{F}^{\times}$  of order T + 1,  $G := \langle g \rangle$ . Let  $D \subset \mathbb{F}$  such that  $D \cap G = \emptyset$  and  $\rho |D| = T$ .  $\rho \in (0, 1)$ 

Reed-Solomon code of dim.  $k : \mathsf{RS}[\mathbb{F}, D, k] := \{P|_D : D \to \mathbb{F} \mid P \in \mathbb{F}[X], \deg P < k\}.$ 

**Encoding the trace (prover's side)** For j from 0 to a:

- 1. Interpolate  $P_j(X)$  of degree  $\leq T$  such that  $P_j(g^i) = R_j[i]$
- 2. Evaluate  $P_j(X)$  on D.

	$P_0$	$P_1$	$P_2$	$P_3$	$P_4$	$P_5$	$P_6$	
$g^0$	0	1	0	1	0	1	0	42
$g^1$	1	0	1	0	1	0	0	21
$g^2$	0	0	0	0	0	0	1	64
$g^3$	0	0	0	0	0	1	0	32
$g^4$	0	0	0	0	1	0	0	16
$g^5$	0	0	0	1	0	0	0	8
$g^6$	0	0	1	0	0	0	0	4
$g^7$	0	1	0	0	0	0	0	2
$g^8$	1	0	0	0	0	0	0	1

We want to transform  $(x_{AIR}, w_{AIR})$  into "encoded" counterparts  $(x_{RS-AIR}, w_{RS-AIR})$ .

**First**, we force the encoded registers to be consistent with the specified input/output. **Instance reduction** ( $x_{AIR} \rightarrow x_{RS-AIR}$ ) [Part 1/2] Define (a + 1) "boundary" polynomials ( $B_j(X)$ ) $_{0 \le j \le a}$  such that  $\deg B_j < 2$ ,



and vanishing polynomial  $Z_{io}(X) := (X - 1)(X - g^T)$ .

Witness reduction ( $w_{AIR} \rightarrow w_{RS-AIR}$ ) For j from 0 to a:

1. Interpolate  $P_j(X)$  of degree  $\leq T$  such that  $P_j(g^i) = R_j[i]$ 

2. Evaluate  $\frac{P_j(X) - B_j(X)}{Z_{io}(X)}$  on D to get  $f_j : D \to \mathbb{F}$  (expected to be a poly of deg  $\leq T - 2$ )

$$\begin{cases} P_j(g^0) = B_j(g^0) \\ P_j(g^T) = B_j(g^T) \end{cases} \iff \begin{cases} (X-1) \mid (P_j(X) - B_j(X)) \\ (X-g^T) \mid (P_j(X) - B_j(X)) \end{cases}$$

We want to transform  $(x_{AIR}, w_{AIR})$  into "encoded" counterparts  $(x_{RS-AIR}, w_{RS-AIR})$ .

**First**, we force the encoded registers to be consistent with the specified input/output. **Instance reduction** ( $x_{AIR} \rightarrow x_{RS-AIR}$ ) [Part 1/2] Define (a + 1) "boundary" polynomials ( $B_i(X)$ )<sub>0<i<a</sub> such that deg  $B_i < 2$ ,



and vanishing polynomial  $Z_{io}(X) := (X - 1)(X - g^T)$ .

Witness reduction ( $w_{AIR} \rightarrow w_{RS-AIR}$ ) For j from 0 to a:

1. Interpolate  $P_j(X)$  of degree  $\leq T$  such that  $P_j(g^i) = R_j[i]$ 

**2. Evaluate**  $\frac{P_j(X) - B_j(X)}{Z_{io}(X)}$  on D to get  $f_j : D \to \mathbb{F}$  (expected to be a poly of deg  $\leq T - 2$ )

If  $\mathbf{f} = (f_0, \dots, f_a)$  is an encoding of a valid execution trace, then, for any j,  $f_j$  is a codeword of a code  $RS[\mathbb{F}, D, k]$ .

(Here, k = T - 1)

Witness  $w_{\text{RS-AIR}} = (f_0, \ldots, f_j)$  such that  $\forall x \in D, f_j(x) = \frac{P_j(x) - B_j(x)}{Z_{\text{io}}(x)}$ .

#### Second, define "rational constraints" on the RS-encoded witness.

Recall AIR's polynomial constraints:  $\forall C_k \in C, \forall i < T, C_k(\mathbf{S}[i], \mathbf{S}[i+1]) = 0.$ This means  $C_k(P_0(x), \dots, P_a(x), P_0(gx), \dots, P_a(gx)) = 0$  for all  $x \in \{g^i \mid 0 \le i < T\} = G \setminus \{g^T\}.$ 

Witness  $w_{\text{RS-AIR}} = (f_0, \ldots, f_j)$  such that  $\forall x \in D, f_j(x) = \frac{P_j(x) - B_j(x)}{Z_{\text{io}}(x)}$ .

#### Second, define "rational constraints" on the RS-encoded witness.

Recall AIR's polynomial constraints:  $\forall C_k \in \mathcal{C}, \forall i < T, C_k(\mathbf{S}[i], \mathbf{S}[i+1]) = 0.$ This means  $C_k(P_0(x), \dots, P_a(x), P_0(gx), \dots, P_a(gx)) = 0$  for all  $x \in \{g^i \mid 0 \le i < T\} = G \setminus \{g^T\}.$ 

Idea: Define  $Z_G(X) := \prod_{h \in G} (X - h)$ . Then,

 $\frac{(X-g^T)}{Z_G(X)}C_k((P_0(X),\ldots,P_a(X),P_0(gX),\ldots,P_a(gX)))$  must be a polynomial.

Witness  $w_{\text{RS-AIR}} = (f_0, \ldots, f_j)$  such that  $\forall x \in D, f_j(x) = \frac{P_j(x) - B_j(x)}{Z_{\text{io}}(x)}$ .

Second, define "rational constraints" on the RS-encoded witness.

Recall AIR's polynomial constraints:  $\forall C_k \in C, \forall i < T, C_k(\mathbf{S}[i], \mathbf{S}[i+1]) = 0.$ This means  $C_k(P_0(x), \dots, P_a(x), P_0(gx), \dots, P_a(gx)) = 0$  for all  $x \in \{g^i \mid 0 \le i < T\} = G \setminus \{g^T\}.$ Idea: Define  $Z_G(X) := \prod_{h \in G} (X - h).$  Then,  $\frac{(X - g^T)}{Z_G(X)} C_k((P_0(X), \dots, P_a(X), P_0(gX), \dots, P_a(gX)))$  must be a polynomial.

We don't have access to  $P_j$  directly. But on D, it can be expressed with  $f_j$ ,  $B_j$  and  $Z_{io}$ ! Instance reduction ( $x_{AIR} \rightarrow x_{RS-AIR}$ ) [Part 2/2]

Let  $\mathbf{f} = (f_0, \dots, f_a) \in (\mathbb{F}^D)^{a+1}$ . For each  $C_k \in \mathcal{C}$ , define  $C_k[\mathbf{f}] : D \to \mathbb{F}$  s.t. for all  $x \in D$ :  $C_k[\mathbf{f}](x) = \frac{(x - g^T)}{Z_G(x)} C_k \left( (f_0 Z_{\mathsf{io}} + B_0)(x), \dots, (f_a Z_{\mathsf{io}} + B_a)(x), (f_0 Z_{\mathsf{io}} + B_0)(gx), \dots, (f_a Z_{\mathsf{io}} + B_a)(gx) \right)$  Witness  $w_{\text{RS-AIR}} = (f_0, \ldots, f_j)$  such that  $\forall x \in D, f_j(x) = \frac{P_j(x) - B_j(x)}{Z_{\text{io}}(x)}$ .

Second, define "rational constraints" on the RS-encoded witness.

Recall AIR's polynomial constraints:  $\forall C_k \in C, \forall i < T, C_k(\mathbf{S}[i], \mathbf{S}[i+1]) = 0.$ This means  $C_k(P_0(x), \dots, P_a(x), P_0(gx), \dots, P_a(gx)) = 0$  for all  $x \in \{g^i \mid 0 \le i < T\} = G \setminus \{g^T\}.$ Idea: Define  $Z_G(X) := \prod_{h \in G} (X - h).$  Then,  $\frac{(X - g^T)}{Z_G(X)} C_k((P_0(X), \dots, P_a(X), P_0(gX), \dots, P_a(gX)))$  must be a polynomial.

We don't have access to  $P_j$  directly. But on D, it can be expressed with  $f_j$ ,  $B_j$  and  $Z_{io}$ ! Instance reduction ( $x_{AIR} \rightarrow x_{RS-AIR}$ ) [Part 2/2]

Let  $\mathbf{f} = (f_0, \dots, f_a) \in (\mathbb{F}^D)^{a+1}$ . For each  $C_k \in \mathcal{C}$ , define  $C_k[\mathbf{f}] : D \to \mathbb{F}$  s.t. for all  $x \in D$ :  $C_k[\mathbf{f}](x) = \frac{(x - g^T)}{Z_G(x)} C_k \left( (f_0 Z_{\mathsf{io}} + B_0)(x), \dots, (f_a Z_{\mathsf{io}} + B_a)(x), (f_0 Z_{\mathsf{io}} + B_0)(gx), \dots, (f_a Z_{\mathsf{io}} + B_a)(gx) \right)$ 

If  $\mathbf{f} = (f_0, \dots, f_a)$  is an encoding of a valid execution trace, then, for any k,  $C_k[\mathbf{f}]$  is a codeword of a RS code RS[ $\mathbb{F}$ , D,  $k_c$ ]. (Here,  $k_c = T + 5$ ) Witness  $w_{\text{RS-AIR}}$ : an interleaved word  $\mathbf{f} = (f_0, \dots, f_a) \in (\mathbb{F}^D)^{a+1}$ 

#### **Instance** *x*<sub>RS-AIR</sub>:

For input-output:  $(B_j(X))_{0 \le j \le a}$  of deg < 1 and  $Z_{io}(X) = (X - g^0)(X - g^T)$ Rational constraints  $(C_k[\cdot])_{0 \le k \le p}$   $C_k[\cdot]$  and any  $\mathbf{f} \in (\mathbb{F}^D)^{a+1}$  jointly define  $C_k[\mathbf{f}] \in \mathbb{F}^D$ Assignment code  $\mathsf{RS}[\mathbb{F}, D, k]$  and constraint code  $\mathsf{RS}[\mathbb{F}, D, k_c]$ 

#### **RS-AIR relation** $\mathcal{R}_{RS-AIR}$

$$x_{\text{RS-AIR}}, w_{\text{RS-AIR}} \in \mathcal{R}_{\text{RS-AIR}} \iff w_{\text{RS-AIR}} = \mathbf{f} = (f_0, \dots, f_a) \text{ satisfies } \begin{cases} \forall j, f_j \in \text{RS}[\mathbb{F}, D, k] \\ \forall k, C_k[\mathbf{f}] \in \text{RS}[\mathbb{F}, D, k_c] \end{cases}$$

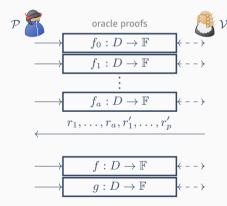
**Reduction:** From  $(x_{AIR}, w_{AIR})$ , we've just defined an RS-encoded pair  $(x_{RS-AIR}, w_{RS-AIR})$  satisfying:

**Perfect completeness**If  $(x_{AIR}, w_{AIR}) \in \mathcal{R}_{AiR}$ , then  $(x_{RS-AIR}, w_{RS-AIR}) \in \mathcal{R}_{RS-AIR}$ .**Perfect soundness**If  $x_{AIR} \notin \mathcal{L}_{AIR}^{1}$ , then  $x_{RS-AIR} \notin \mathcal{L}_{RS-AIR}$ .

<sup>1</sup>For a binary relation  $\mathcal{R} = \{(x, w)\}$ , its associated language is  $\mathcal{L} = \{x \mid \exists w, (x, w) \in \mathcal{R}\}$ .

#### Idea: average distance to a code V

Let V be a linear code and  $u_0, \ldots, u_l : D \to \mathbb{F}$ . Denote  $\Delta$  relative Hamming distance. Then,  $\Delta(u_0 + \sum_{j=1}^l r_j u_j, V) \simeq \max_j \Delta(u_j, V)$  with high proba over  $r_1, \ldots, r_l$ 

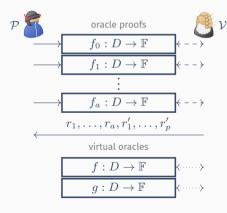


$$\mathcal{P} \text{ computes} \left\{ egin{array}{l} f := f_0 + \sum_{j=1}^a r_j f_j \ g := C_0[\mathbf{f}] + \sum_{k=1}^p r'_k C_k[\mathbf{f}] \end{array} 
ight.$$

 $\mathcal{P}$  and  $\mathcal{V}$  check if f and g are RS codewords, with  $O(\log T)$  queries and verifier complexity.

#### Idea: average distance to a code V

Let V be a linear code and  $u_0, \ldots, u_l : D \to \mathbb{F}$ . Denote  $\Delta$  relative Hamming distance. Then,  $\Delta(u_0 + \sum_{j=1}^l r_j u_j, V) \simeq \max_j \Delta(u_j, V)$  with high proba over  $r_1, \ldots, r_l$ 



 ${\mathcal P}$  computes

$$\mathsf{es} \left\{ \begin{array}{l} f := f_0 + \sum_{j=1}^a r_j f_j \\ g := C_0[\mathbf{f}] + \sum_{k=1}^p r'_k C_k[\mathbf{f}] \end{array} \right.$$

 $\mathcal{P}$  and  $\mathcal{V}$  check if f and g are RS codewords, with  $O(\log T)$  queries and verifier complexity.

**Remark:**  $\mathcal{P}$  doesn't need to send f and g. By querying  $\mathbf{f}(x_0)$  and  $\mathbf{f}(gx_0)$ ,  $\mathcal{V}$  can compute  $f(x_0)$  and each  $C_k[\mathbf{f}](x_0)$ , thus  $g(x_0)$ .

Notice that  $\mathcal{V}$  computes  $Z_G(x_0)$  for  $x_0 \in D$  in  $O(\log T)$  ops because  $Z_G(X) = \prod_{h \in G} (X - h) = X^{T+1} - 1$ .

```
If the Collatz sequence starting with u = 42 reaches 1 after T = 8 iterations,
then f \in RS[\mathbb{F}, D, k] and g \in RS[\mathbb{F}, D, k_c].
```

```
Otherwise, with very high proba,
then f is \delta-far from RS[\mathbb{F}, D, k] or g is \delta-far from RS[\mathbb{F}, D, k_c],
with \delta \to 1 when \frac{\max(k, k_c)}{|D|} \to 0.
```

An IOP with logarithmic query/verifier complexities is needed to **test proximity** to a Reed-Solomon code, meaning a verifier must distinguish between:

- functions which are RS codewords,
- functions which are  $\delta$ -far from any codeword.

Univariate low-degree test: FRI protocol

#### **Reed-Solomon Proximity Testing**

Input:	a code $RS[\mathbb{F},D,k]$ , a parameter $\delta$	
Input oracle:	$f:D \to \mathbb{F}$	
<b>Completeness:</b>	If $f \in RS[\mathbb{F}, D, k]$ , then $\exists P \Pr[\langle P, V  angle = 1] = 1$	
Soundness:	If $\Delta(f, RS[\mathbb{F}, D, k]) > \delta$ , then $\forall \tilde{P} \Pr[\langle \tilde{P}, V \rangle = 1] < err(\delta)$	
	$\Delta$ relative Hamming distance	

#### **Naive test**

- 1. Query k entries of  $f \in \mathbb{F}^D$ :  $f(x_0), \ldots, f(x_{k-1})$ ,
- 2. Reconstruct poly P by interpolation, then evaluate it in a (k + 1)-th point  $x_k \in D$ ,
- 3. Accept iff  $P(x_k) = f(x_k)$ .

**Soundness:**  $\mathcal{V}$  accepts with proba  $< 1 - \delta$ **Problem:** # queries is **linear** in |D|.  $\mathcal{V}$  can't do better on his own. But a prover  $\mathcal{P}$  can help.

#### RS IOP of Proximity FRI Protocol

[Ben-Sasson-Bentov-Horesh-Riabzev'18]

Γ	# rounds	$< \log  D $
	# queries	$O(2\log D )$
	prover time	< 6 D
	verifier time	$O(21 \log  D )$
L	oracle length	<  D /3

Let  $k = 2^r$ . Assume there exists  $\omega \in \mathbb{F}^{\times}$  of order a large power of 2, and consider evaluation domains  $D := \langle \omega \rangle$  and  $D' := \langle \omega^2 \rangle (|D| > k)$ .

How to check if  $f: D \to \mathbb{F}$  is in RS[ $\mathbb{F}, D, k$ ]?

Let  $k = 2^r$ . Assume there exists  $\omega \in \mathbb{F}^{\times}$  of order a large power of 2, and consider evaluation domains  $D := \langle \omega \rangle$  and  $D' := \langle \omega^2 \rangle (|D| > k)$ .

How to check if  $f: D \to \mathbb{F}$  is in RS[ $\mathbb{F}, D, k$ ]?

#### Idea:

- Define P(X) such that P(x) = f(x) for every  $x \in D$
- Split P into g, h, such that  $P(X) = g(X^2) + Xh(X^2)$  deg  $g, \deg h < |D|/2$

 $\deg P < |D|$ <br/>deg  $g, \deg \frac{h}{l} < |D|/2$ 

- For every  $x \in D$ ,  $f(x) = g(x^2) + x \cdot h(x^2)$
- Consider  $g, h: D' \to \mathbb{F}$  with  $|D'| = \frac{1}{2}|D|$
- For  $\alpha \in \mathbb{F}$ , define Fold  $[f, \alpha] : D' \to \mathbb{F}$  by Fold  $[f, \alpha](y) = g(y) + \alpha \cdot h(y)$

Let  $k = 2^r$ . Assume there exists  $\omega \in \mathbb{F}^{\times}$  of order a large power of 2. and consider evaluation domains  $D := \langle \omega \rangle$  and  $D' := \langle \omega^2 \rangle$  (|D| > k).

How to check if  $f: D \to \mathbb{F}$  is in RS[ $\mathbb{F}, D, k$ ]?

#### Idea:

- Define P(X) such that P(x) = f(x) for every  $x \in D$  $\deg P < |D|$
- Split P into q, h, such that  $P(X) = q(X^2) + Xh(X^2)$  deg q, deg h < |D|/2

- For every  $x \in D$ ,  $f(x) = q(x^2) + x \cdot h(x^2)$
- Consider  $g, h: D' \to \mathbb{F}$  with  $|D'| = \frac{1}{2}|D|$
- For  $\alpha \in \mathbb{F}$ , define FOLD  $[f, \alpha] : D' \to \mathbb{F}$  by FOLD  $[f, \alpha](y) = q(y) + \alpha \cdot h(y)$

 $\forall \alpha, f \in \mathsf{RS}[\mathbb{F}, D, k] \implies \mathsf{Fold}[f, \alpha] \in \mathsf{RS}[\mathbb{F}, D', k/2]$ 

Let  $k = 2^r$ . Assume there exists  $\omega \in \mathbb{F}^{\times}$  of order a large power of 2, and consider evaluation domains  $D := \langle \omega \rangle$  and  $D' := \langle \omega^2 \rangle$  (|D| > k).

How to check if  $f: D \to \mathbb{F}$  is in RS[ $\mathbb{F}, D, k$ ]?

#### Idea:

- Define P(X) such that P(x) = f(x) for every  $x \in D$  $\deg P < |D|$
- Split P into q, h, such that  $P(X) = q(X^2) + Xh(X^2)$  deg q, deg h < |D|/2

- For every  $x \in D$ ,  $f(x) = q(x^2) + x \cdot h(x^2)$
- Consider  $g, h: D' \to \mathbb{F}$  with  $|D'| = \frac{1}{2}|D|$
- For  $\alpha \in \mathbb{F}$ , define FOLD  $[f, \alpha] : D' \to \mathbb{F}$  by FOLD  $[f, \alpha](y) = q(y) + \alpha \cdot h(y)$

 $\forall \alpha, f \in \mathsf{RS}[\mathbb{F}, D, k] \implies \mathsf{FOLD}[f, \alpha] \in \mathsf{RS}[\mathbb{F}, D', k/2]$ 

Observe, for all  $x \in D$ ,

$$\operatorname{FOLD}\left[f,\alpha\right](x^2) = \frac{f(x)+f(-x)}{2} + \alpha \frac{f(x)-f(-x)}{2x}.$$

Compute FOLD  $[f, \alpha](y)$  with only **2 queries** to f.

### Folding preserves distance to the code

### **Notations:**

•  $\mathsf{RS}_0 := \mathsf{RS}[\mathbb{F}, D, k]$  and  $\mathsf{RS}_1 := \mathsf{RS}[\mathbb{F}, D', k/2]$  of rate  $\rho := \frac{k}{|D|}$ 

Let  $\kappa$  be a security parameter. Assume  $|\mathbb{F}|$  is large enough, i.e.  $O_{\rho,\delta}\left(\frac{|D|^2}{|\mathbb{F}|}\right) = \operatorname{negl}(\kappa)$ .

**Theorem** [Ben-Sasson-Carmon-Ishai-Kopparty'20]

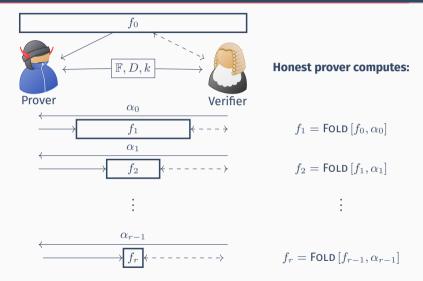
Assume  $\delta < 1 - \sqrt{\rho}$ . Let  $g, h : D' \to \mathbb{F}$ . If either  $\Delta(g, \mathsf{RS}_1) > \delta$  or  $\Delta(h, \mathsf{RS}_1) > \delta$ , then

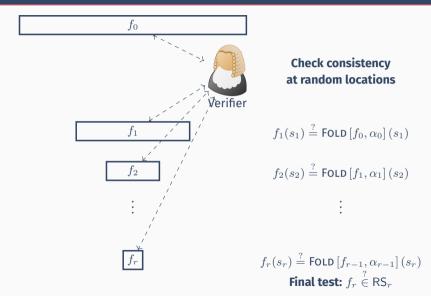
$$\Pr_{\alpha \in \mathbb{F}}[\Delta(g + \alpha h, \mathsf{RS}_1) < \delta] < \mathsf{negl}(\kappa)$$

### Corollary

Assume  $\delta < 1 - \sqrt{\rho}$ . If  $\Delta(f, \mathsf{RS}_0) > \delta$ , then

```
\Pr_{\alpha \in \mathbb{F}}[\Delta(\mathsf{FOLD}\left[f,\alpha\right],\mathsf{RS}_1) < \delta] < \mathsf{negl}(\kappa)
```





**Soundness:** If  $\Delta(f, \mathsf{RS}[\mathbb{F}, D, k]) > \delta$ ,  $\mathcal{V}$  accepts with proba  $< \mathsf{err}$ .

 $\kappa$  security parameter

#### Theorem

Assuming  $\delta < 1 - \sqrt{\rho}$  ( $\rho$  is code rate),

```
\begin{split} & \mathsf{err} < \mathsf{err}_{\mathsf{commit}} + \left(\mathsf{err}_{\mathsf{query}}\right)^l \\ & < \mathsf{negl}(\kappa) + (1 - \delta)^l \end{split}
```

To get error  $err = negl(\kappa)$ , repeat query phase enough time (*l* times).

For instance, for  $\kappa = 128$ .

Take  $|\mathbb{F}| > 2^{256}$ ,  $|D| = 2^{20}$ ,  $k = 2^{16}$ ,  $\delta = 1 - \sqrt{\rho} - 2^{-14} \simeq 3/4$ . Then, repeat l = 65 times the query phase.

If  $\Delta(f, \mathsf{RS}[\mathbb{F}, D, k]) > \delta$ , then  $\mathcal{V}$  accepts with proba  $< 2^{-128}$ .

Beyond Reed-Solomon codes

### **Tensor product of RS codes**

$$\mathsf{RS}[\mathbb{F}, L, d]^{\otimes m} = \left\{ f \in {\mathbb{F}^L}^m \mid P \in \mathbb{F}[X_1, ..., X_m], \operatorname{deg}_{X_i} P < d, f = P \mid_{L^m} \right\}$$

### **Reed-Muller codes**

$$\mathsf{RM}[\mathbb{F}, L, d, m] = \left\{ f \in \mathbb{F}^{L^m} \mid P \in \mathbb{F}[X_1, ..., X_m], \operatorname{deg_{tot}} P < d, f = P|_{L^m} \right\}$$

Is it possible to construct IOPP for  $\text{RS}^{\otimes}$  and RM families with efficiency similar to the RS case?

#### Theorem (informal)

There exists an IOPP  $(\mathcal{P},\mathcal{V})$  for  $\mathsf{RS}^\otimes$  (resp. RM codes) with

- ✓ linear prover time
- ✓ linear (interactive) proof length

- logarithmic query complexity
- logarithmic verifier time

#### Theorem (informal)

There exists an IOPP  $(\mathcal{P},\mathcal{V})$  for  $\mathsf{RS}^\otimes$  (resp. RM codes) with

- linear prover time
- linear (interactive) proof length

- logarithmic query complexity
- ✓ logarithmic verifier time
- 1. Decompose *m*-variate polynomial f into  $2^m$  *m*-variate polynomials  $g_u, u \in \{0, 1\}^m$ .
- 2. Define folding of f as a random linear combination of the  $g_u$ 's:

$$\operatorname{Fold}\left[f,p\right](y) = \sum_{u \in \{0,1\}^m} p^u g_u(y). \tag{RS}^{\otimes}$$

#### **Properties:**

completeness locally computable distance preservation

$$\begin{array}{l} \mathsf{Fold}\left[\cdot,p\right](C)\subseteq C'\\ 2^m \text{ queries}\\ f \ \delta\text{-far for } C \implies \mathsf{Fold}\left[f,p\right]\delta'\text{-far from } C' \text{ (w.h.p.)} \end{array}$$

### Theorem (informal)

There exists an IOPP  $(\mathcal{P},\mathcal{V})$  for  $\mathsf{RS}^\otimes$  (resp. RM codes) with

- linear prover time
- linear (interactive) proof length

- logarithmic query complexity
- logarithmic verifier time
- 1. Decompose *m*-variate polynomial f into  $2^m$  *m*-variate polynomials  $g_u, u \in \{0, 1\}^m$ .
- 2. Define folding of f as a random linear combination of the  $g_u$ 's:

$$\mathsf{FOLD}\left[f,(p,q)\right](y) = \sum_{u \in \{0,1\}^m} p^u g_u(y) + \sum_{u \in \{0,1\}^m \setminus \{0\}} q^u y^u g_u(y). \tag{RM}$$

#### **Properties:**

 $\begin{array}{ll} \mbox{completeness} & \mbox{FOLD}\,[\cdot,p]\,(C)\subseteq C' \\ \mbox{locally computable} & 2^m \mbox{ queries} \\ \mbox{distance preservation} & f \ \delta\mbox{-far for } C \implies \mbox{FOLD}\,[f,p] \ \delta'\mbox{-far from } C' \ \mbox{(w.h.p.)} \end{array}$ 

#### Theorem (informal)

There exists an IOPP  $(\mathcal{P},\mathcal{V})$  for  $\mathsf{RS}^\otimes$  (resp. RM codes) with

- linear prover time
- linear (interactive) proof length

- logarithmic query complexity
- 🖌 logarithmic verifier time

### Soundness (informal)

```
Let \delta be the relative distance of f to RM (resp. RS<sup>\otimes</sup>).
```

Assuming  $\delta < c$ ,  $err(\delta) < negl + (1 - \delta)^l$ .

**X** Soundness threshold c not as good as  $1 - \sqrt{\rho}$  (RS case).

ightarrow greater repetition parameter l, i.e. more queries, thus longer non-interactive proofs.

# The rest of the story.

Recall: arithmetization transforms "instructions set" of a program into constraints on low-degree polynomials, e.g. vanish on a given set.

We can use our IOPP to check that  $S(\mathbf{X})$  committed via  $S_{|H^m} : H^m \to \mathbb{F}$  vanishes on a set  $G^m$ , where  $G \cap H = \emptyset$  with a succinct proof.

#### What about other codes?

With Jade Nardi: a "FRI-like" IOPP for some families of **Algebraic Geometry codes**. https://eccc.weizmann.ac.il/report/2020/165/

# The rest of the story.

Recall: arithmetization transforms "instructions set" of a program into constraints on low-degree polynomials, e.g. vanish on a given set.

We can use our IOPP to check that  $S(\mathbf{X})$  committed via  $S_{|H^m} : H^m \to \mathbb{F}$  vanishes on a set  $G^m$ , where  $G \cap H = \emptyset$  with a succinct proof.

#### What about other codes?

With Jade Nardi: a "FRI-like" IOPP for some families of **Algebraic Geometry codes**. https://eccc.weizmann.ac.il/report/2020/165/

### **Future work:**

- · Construct building-blocks for multivariate/AG code-based arithmetization
- Find more "nice families" of AG codes
- Improve soundness of AG-IOPP