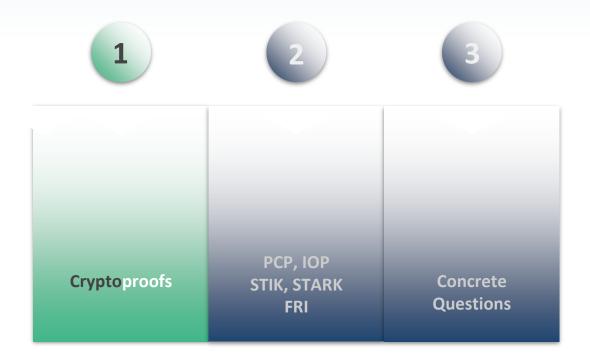




# From PCP to ZK-STARK

Eli Ben-Sasson | Chief Scientist (East) | February 2019

### **Overview**





#### **INTEGRITY**

The quality of being honest (Dictionary)



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### **COMPUTATIONAL INTEGRITY**

The quality of a computation being executed honestly



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### CI Statement: total=\$138.16

- Prover: Party producing proof (here: Grocer)
- Verifier: Party checking proof (here: Customer)

APPT-SOUP/SAL-ENTREE-VEG/POT-DES Kebab Sampler	713	7
APPT-SOUP/SAL-ENTREE-VEG/POT-DES		BEV
Kebab Sampler		
		00
Spinach salad	8	50
cucumber salad	8	50
etticken kebab	13	50
Lamb + veg couscous	19	00
Lamb Tagine	19	00
side Rice	4	00
1 COKE @ \$ 2.50	2	50
11 Beer @ \$7.00	14	00
pessent Briwatts@\$6	12	OD
→ white +dark	111	00
15 % SERVICE CHARGE:	18	00
Tax	9	16
Total	138	160
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# **Grocery receipts are proofs** of computational integrity

- Verification via naive re-execution of computation
- Proof is (i) deterministic, (ii) error free, (iii) one-shot (non-interactive)

GUESTCHEO	CK	IM			
Parte Table Guests Server 367137					
APPT-SOUP/SAL-ENTREE-VEG/POT-DES	I D	00			
Kebab Sampler	8	50			
Spinach salad	8	50			
cucumber salad	13	50			
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# **Grocery receipts are proofs** of computational integrity

- Verification via naive re-execution of computation
- Proof is (i) deterministic, (ii) error free, (iii) one-shot (non-interactive)
- Modern CI proofs have (i) randomness, (ii) small error, (iii) interaction; in return, offer many benefits...

(	GUESTCHEC	CK	IM
9/	tate Table Guests Server 36' CO 42 5 K 36' CO TENTREE-VEG/POT-DES	713	
AFI	Kebab Sampler	10	0
	Spinach salad	8	5
	cucumber salad	8	S
	etticken kebab	13	5
	Lamb + veg couscous	19	0
	Lamb Tagine	19	0
	side Rice	4	0
1	COKE @\$2.50	2	5
11		14	0
	Dessert Briwatts@\$6	12	0
	1- white +dark	111	0
	15 % SERVICE CHARGE:	18	0
	Tax	9	1
	Total	138	1
	Thank You — Please Come Again	1	





IP, ZK, CS, PCP, MIP, IPCP, LPCP, PCIP, IOP, ...

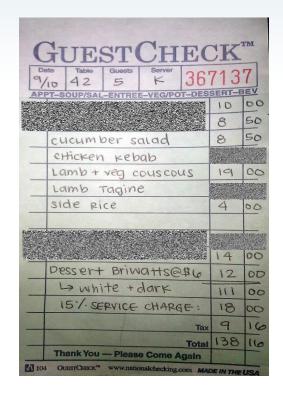
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9/		713	
API	PT-SOUP/SAL-ENTREE-VEG/POT-DES	10	0
	Spinach salad	8	5
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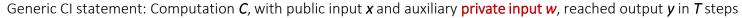


IP, ZK, CS, PCP, MIP, IPCP, LPCP, PCIP, IOP, ...

**Privacy (Zero Knowledge, ZK):** Prover's private inputs are shielded



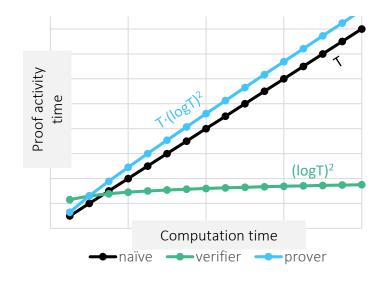


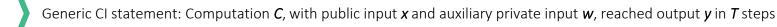




### IP, ZK, CS, PCP, MIP, IPCP, LPCP, PCIP, IOP, ...

- **Privacy (Zero Knowledge, ZK):** Prover's private inputs are shielded
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  - generated in ~ T cycles (quasi-linear in T), and
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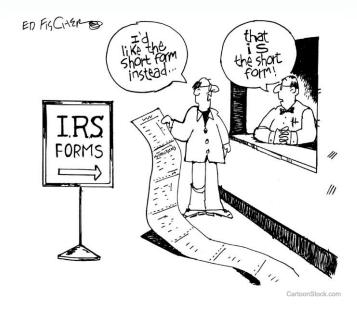






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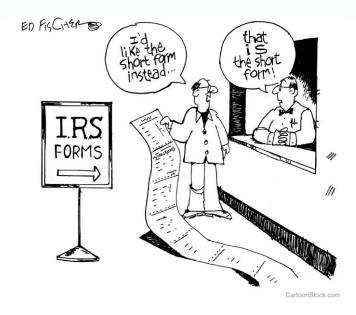






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### **Privacy examples**

- Zcash shielded transaction: shield payer, payee and payment amount
- Paid taxes on all my 2018 transactions, without revealing them
- My crypto exchange is in the black, without showing my positions
- **)** ...



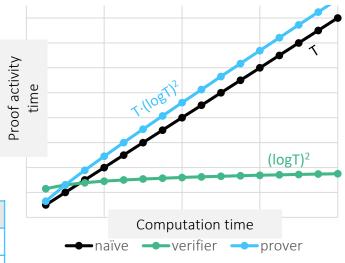


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### **Scalability examples**

Naïve computation time	Verifier time	Prover time
Mega (2 <sup>20</sup> )	400	400∙Mega
Giga (2 <sup>30</sup> )	900	900∙Giga
Tera (2 <sup>40</sup> )	1600	1600∙Tera
Peta (2 <sup>50</sup> )	2500	2500∙Peta





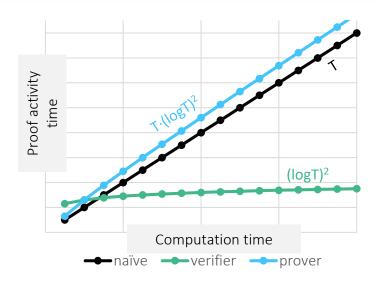
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### **Scalability examples**

### Proof scalability can solve blockchain scalability problems

- > Suppose computing latest Bitcoin state takes 1Peta (2<sup>50</sup>) steps
- A single prover spends 2500·2<sup>50</sup> steps, posts proof
- > All other nodes verify exponentially faster, in 2500 steps



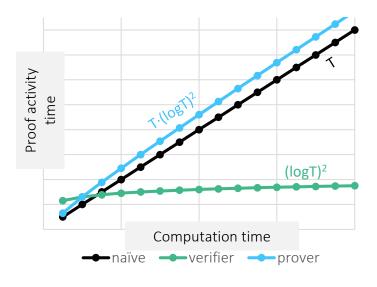


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### tl;dr my research: PCP-based proofs, concrete efficiency

- 1995: ZK w/ scalable verifier was "galactic algorithm"
- 2018: scalable ZK realized in code for meaningful computation
- using scalable PCPs and Interactive Oracle Proofs (IOPs)



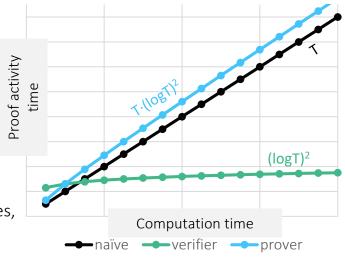


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### tl;dr my research : PCP-based proofs, concrete efficiency

Co-authors [2001-2019]: Iddo Bentov, Alessandro Chiesa, Michael Forbes, Ariel Gabizon, Daniel Genkin, Oded Goldreich, Lior Goldberg, Tom Gur, Matan Hamilis, Prahladh Harsha, Yinon Horesh, Yohay Kaplan, Swastik Kopparty, Or Meir, Evgenya Pergament, Michael Riabzev, Shubhangi Saraf, Mark Silberstein, Hennig Stichtenoth, Nicholas Spooner, Madhu Sudan, Eran Tromer, Salil Vadhan, Madars Virza, Avi Wigderson.





# Many flavors of proof systems



PCP based, linear PCPs, elliptic curve+pairing based succinct NIZKs, proofs for muggles, quadratic span/arithmetic programs (QAP/QSP), interactive oracle proofs (IOP), ...



# Many flavors of proof systems

Variety of theoretical constructions (past 30 yrs)

PCP based, linear PCPs, elliptic curve+pairing based succinct NIZKs, proofs for muggles, quadratic span/arithmetic programs (QAP/QSP), interactive oracle proofs (IOP), ...

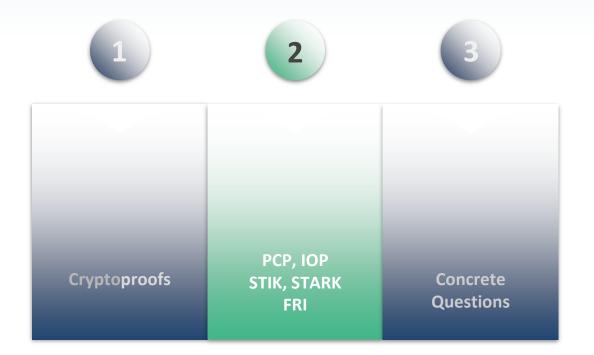
...and implementations (past 5 yrs)

See <u>zkp.science</u>

Pinocchio, libsnark, Zcash, Pepper, Buffet, ZKboo, Ligero, Bulletproofs, Hyrax, libstark, Aurora, ...



### **Overview**

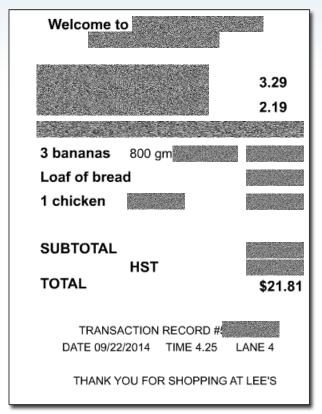




# zk-STARK definition [BBHR18]

### An argument system is a zk-STARK if it satisfies:

- zk zero knowledge: private inputs are shielded
- Scalable: proofs for CI of computation lasting T cycles are
  - generated in roughly T cycles (quasi-linear in T), and
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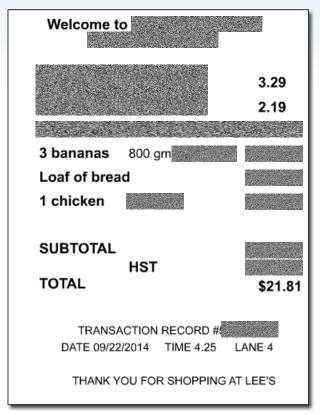




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- ARgument of Knowledge: proof can be generated only by party knowing private input (formally: an efficient procedure can extract the secrets from a prover)
- STARKs may be interactive (use blockchain as source of transparent randomness), gives shorter & safer proofs
- 1st STARK implementation: <u>SCI-POC</u> [BCG+16]; 1st zk-STARK: <u>libstark</u> [BBHR18]



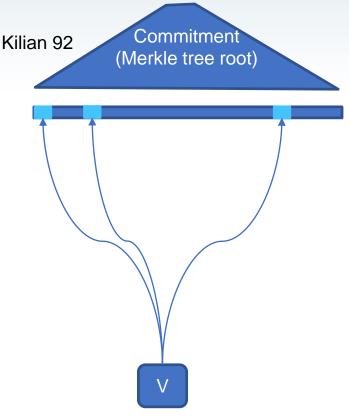


PCPs and polylogarithmic verification

"In <u>this setup</u>, a single reliable PC can monitor the operation of a herd of supercomputers working with possibly extremely powerful but unreliable software and untested hardware" [Babai, Fortnow, Levin, 1991]

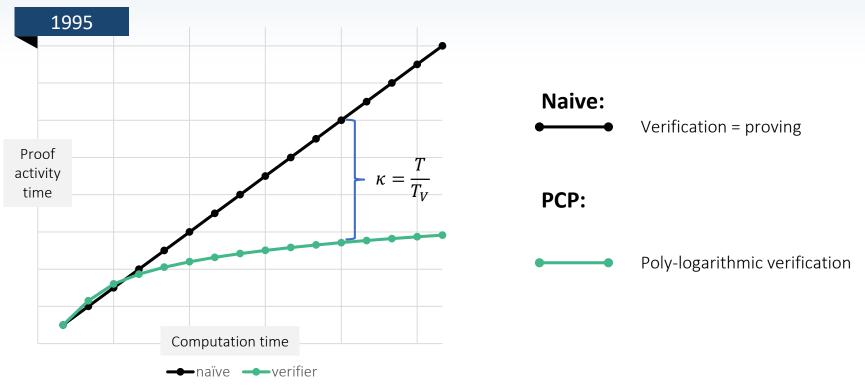
**Setup:** to prove  $x \in L$  for some  $L \in NTIME(T(n))$ 

- Verifier has oracle access to PCP  $\pi$ ,
- Verifier runs in time poly $(n + \log (T(n)))$
- If  $x \in L$  then exists  $\pi$  accepted w.p. 1
- If  $x \in L$  then all  $\pi$  rejected w.p. >  $\frac{1}{2}$

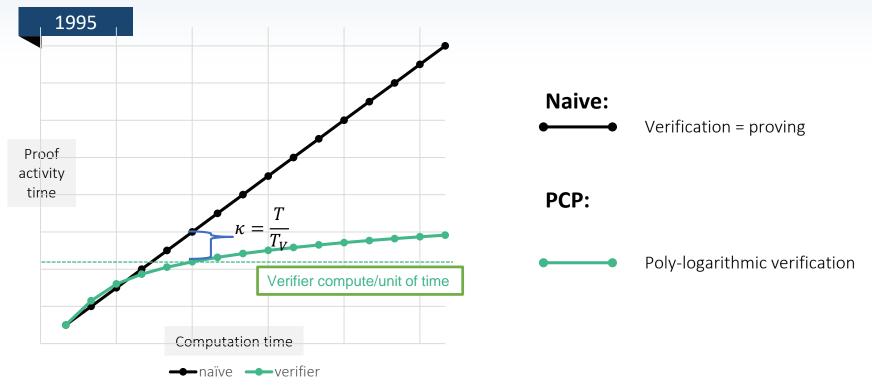




# PCP and scalability [BFL, BFLS, AS, AL, K, M 1991-4]

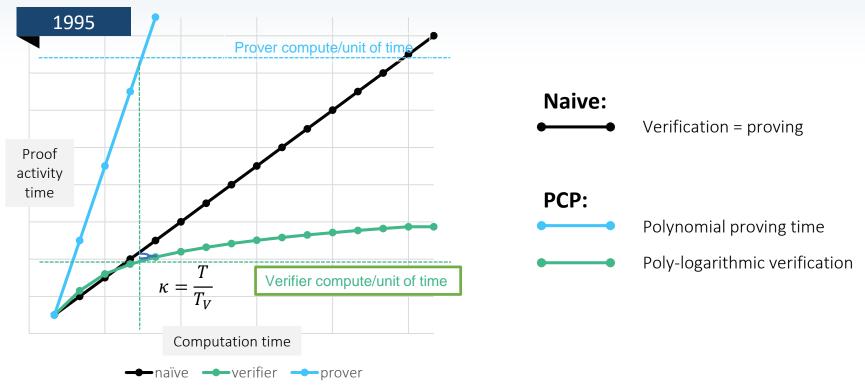


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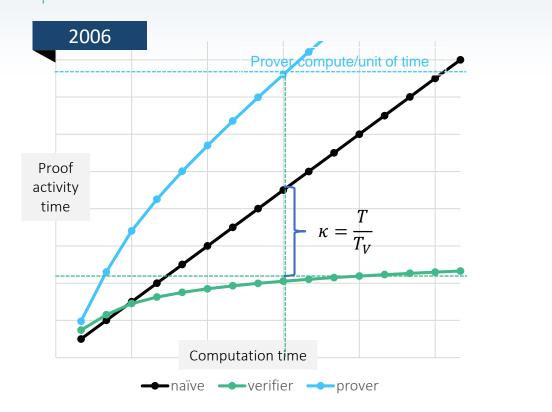


# PCP and scalability [BFL, BFLS, AS, ALMSS, K, M 1991-4]





# PCP and scalability [BS, BGHSV, D, M, 2003-8]





Verification = proving

PCP:

Quasi-linear proving

•

Poly-logarithmic verification

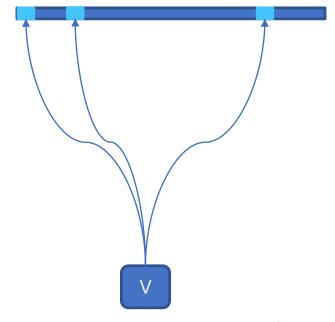


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# Interactive Oracle Proofs (IOP) [RRR16, BCS16]

**IOP setup:** to prove  $x \in L$  for some  $L \in NTIME(T(n))$ 

- Verifier has oracle access to 1<sup>st</sup> oracle  $\pi_0$ ,
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 $n_0$ 

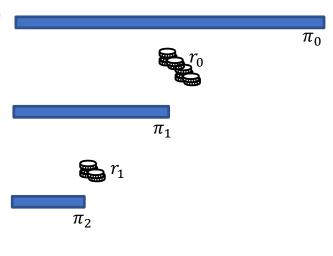




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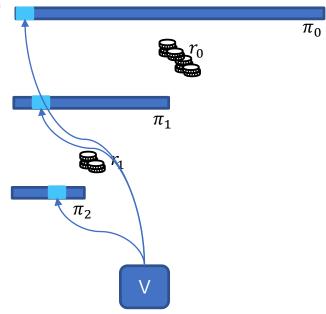




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- Verifier runs in time poly( $n + \log (T(n))$ )
- If  $x \in L$  then  $\exists \pi_0, \pi_1, ..., \pi_t$  accepted w.p. 1
- If  $x \in L$  then all  $\forall \vec{\pi}$  rejected w.p. > ½

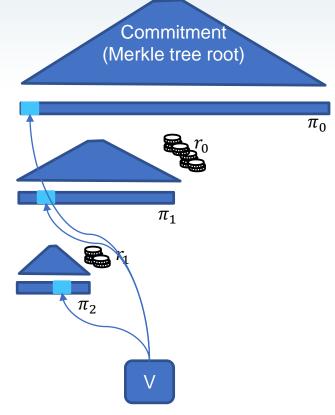




### Scalable Transparent ARgument of Knowledge (STARK)

### An argument system is a zk-STARK if it satisfies:

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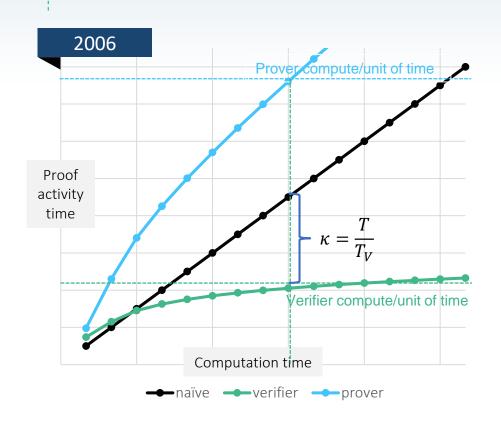
# IOP tl;dr

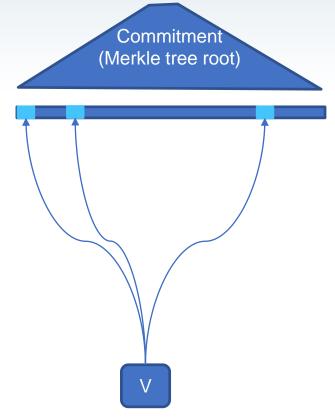
### With IOPs, can prove results that are yet unknown in PCP model

- 2-round IOP with perfect ZK, non-adaptive verifier for NP [BCGV16]
- Doubly-efficient, constant round, Interactive Proofs [RRR16]
- O(1)-round IOP with linear bit-length proofs and constant query comp [BCGRS17]
- Proximity protocols for Reed-Solomon with linear arithmetic complexity and logarithmic query complexity [BBHR18]
- •
- Concretely efficient ZK-STARKs [BBC+16, BBHR18, ...]



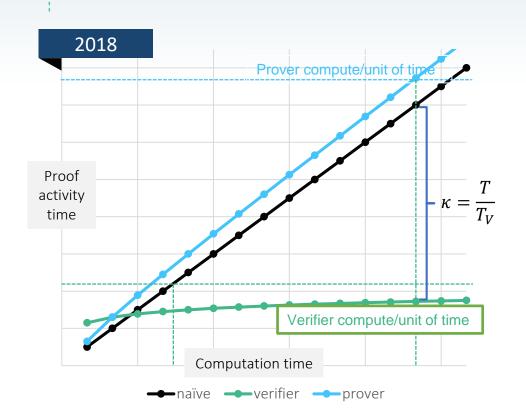
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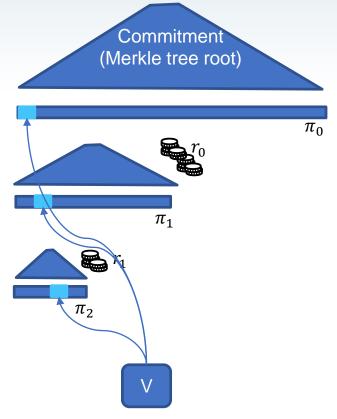






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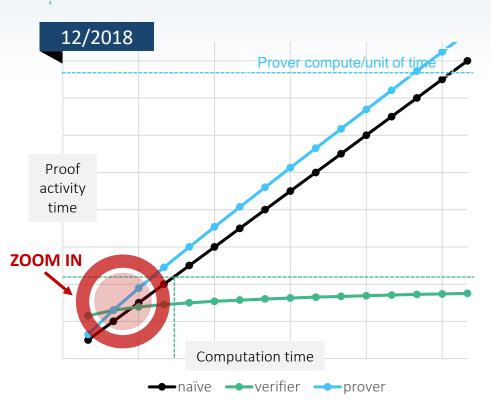


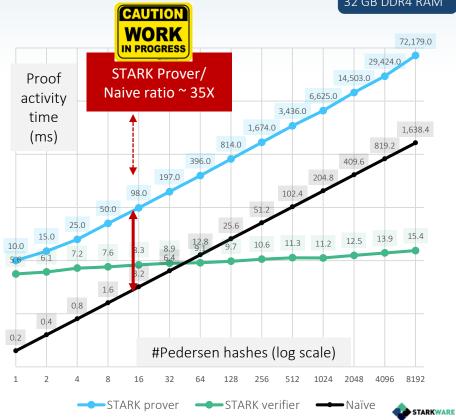




# **IOP** and Scalability





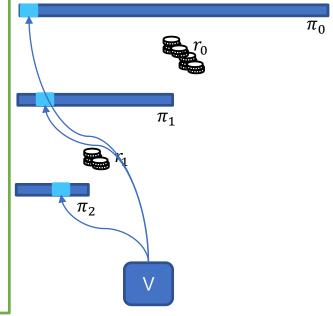


### Scalable Transparent IOP of Knowledge (STIK) [BBHR18]

### Definition:

An IOP for  $L \in NTIME(T(n))$  is said to be:

- Scalable if both of following hold:
  - Proving time  $T_P = \tilde{O}(T(n)) + poly(n) = T(n) \cdot \log^{O(1)} T(n) + poly(n)$
  - Verifying time  $T_V = \text{poly log } T(n)$
- Transparent if all verifier messages are public random coins (Arthur-Merlin protocols)
- IOP of Knowledge if exists Extractor E that extracts in time  $poly\ T(n)$  a witness w for membership of  $x \in L$ , from ``good'' prover  $P_x$





### **Strict** STIK (arithmetic complexity)

### **Definition:**

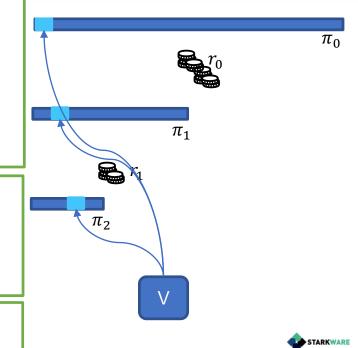
An STIK for  $L \in NTIME(T(n))$  is

- Strictly Scalable if both of following hold:
  - Proving time  $T_P = O(T(n) \log T(n))$
  - Verifying time  $T_V = O(\log T(n)) + \tilde{O}(n)$

Thm [B, Chiesa, Goldberg, Gur, Riabzev, Spooner, 2019]:

Every  $L \in NTIME(T(n))$  has a strict (ZK)-STIK, where  $T_P, T_V$  are measured using arithmetic complexity over field of size O(T(n))

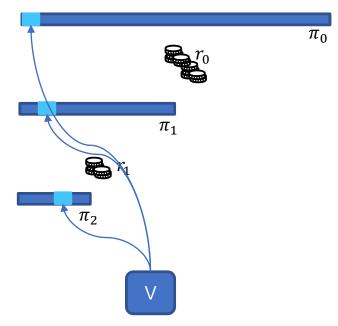
Question: Strict STIK, Boolean complexity?



# Interactive Oracle Proofs of Proximity (IOPP) [RRR16, BCS16]

### **IOPP:** to prove oracle f close to code $C \subset F^n$

- Verifier sends public randomness  $r_0$
- Verifier has oracle access to 1<sup>st</sup> oracle  $\pi_1$
- •
- Verifier runs in time poly $(n + \log (T(n)))$
- If  $f \in C$  then  $\exists \pi_0, \pi_1, ..., \pi_t$  accepted w.p. 1
- Otherwise,  $\forall \vec{\pi}$  rejected w.p.  $>s(\Delta(f,C))$
- s is soundness function, want to maximize it





### Fast Reed-Solomon IOPP (FRI) [B, Bentov, Horesh, Riabzev 2018]

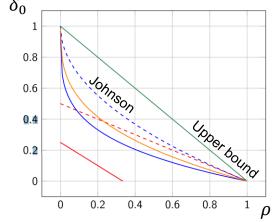
Definition: Reed-Solomon code (low deg polys)  $RS[F, S, \rho] = \{f: S \rightarrow F \mid \deg(f) < \rho |S|\}$ 

### Thm [BBHR 2018]:

 $\forall S \subseteq F, S$  is a group of size  $N = 2^n$ , the code  $RS[F, S, \rho]$  has a (fast) IOPP with

- $T_P \leq 6 \cdot N$
- $T_V \leq 21 \cdot \log N$
- $\delta_0 \approx 1 \rho^{\frac{1}{4}}$  [BKS18]  $s(\delta) \ge \min\{\delta_0, \delta\}$  for  $\delta_0 \approx \frac{1-\rho}{4}$  New:  $\delta_0 \approx 1 \rho^{\frac{1}{3}}$  [BGKS19]

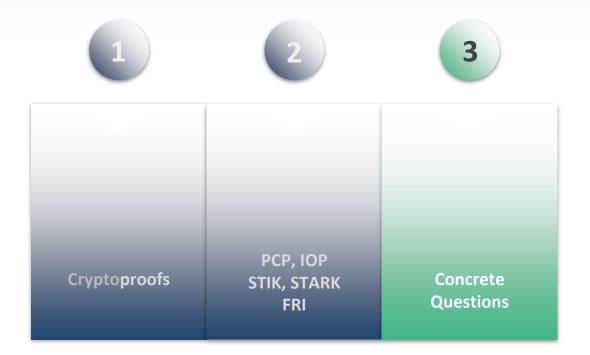




Question: Is  $s(\delta) \ge \delta - \left(\frac{|S|}{|S|}\right)^{O(1)}$  for  $\delta$  as large as  $1 - \rho$ ?



### **Overview**





# Theory questions with practical impact

### 1. Strict STIK, Boolean complexity

- $T_P = O(T(n) \log T(n))$  and  $T_P = O(\log T(n))$
- Approach: use AG codes over constant alphabets
- Requires quasi-linear encoding time for AG codes

### 2. Better soundness analysis for FRI

- Is  $s(\delta) \ge \delta \left(\frac{|S|}{|F|}\right)^{O(1)}$  for  $\delta$  greater than  $1 \rho^{\frac{1}{3}}$ ?
- Reaching Johnson bound  $(1 \sqrt{\rho})$ ? Beyond it?

### Sliding scale conjecture for IOP and STIK?

- Currently soundness error greater than rate  $(\rho)$
- Want soundness error closer to  $poly(\frac{1}{|F|})$
- Perhaps simpler to solve for IOPs than for PCPs?



# **Crypto-Security Questions**

### 1. STARK-friendly crypto primitives

- SHA2/3 STARK "cost"  $\approx 10^4$
- Pedersen STARK "cost"  $\approx 10^3$
- MiMC/Jarvis/Friday "cost"  $\approx 10^2$  [AGRRT16, AD18]
- How low can you get? Algebraic security analysis?

### 2. STARK/STIK security analysis

- Best efficient attack on FRI? on other PCPs/PCPPs? [BBGR16]
- 3. STARK-friendly commitments and accumulators
  - Replace Merkle trees with more efficient data structures? [LM18, BBF18]
  - With Merkle trees in RO model, do you need  $\lambda$  or  $2\lambda$  bits RO to reach  $2^{-\lambda}$  soundness error?
- 4. How to formally verify a STIK/STARK constraint system?



