



CSAIL



# Proof of Space from Stacked Expanders

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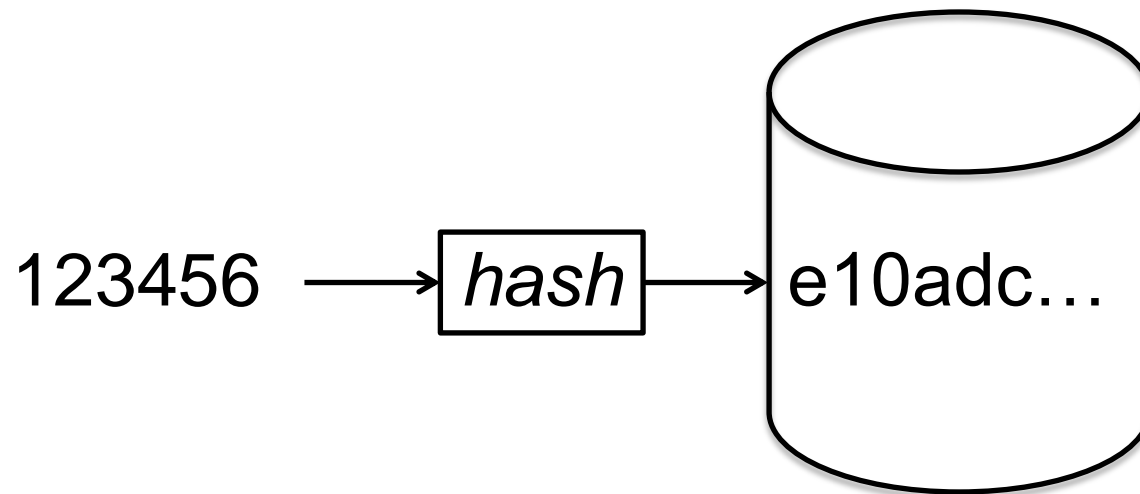
TCC - Nov. 2016

# Outline



- Why memory hardness
- How to define memory hardness
- Improved analysis & constructions

# Password hashing



# ASIC Hash Unit



## Advertised Capacity:

4.73 Th/s

10 Mh/s for CPU, 400,000x

## Power Efficiency:

0.25 W/Gh

10 KW/Gh for CPU, 40,000x

- Want ASIC-resistance hash function
- Memory hard function → ASIC resistance
  - [Abadi et al.'05], [Dwork et al.'03'05], [Percival'09 (scrypt)], [Tromp'14], [Corrigan-Gibbs et al.'16 (Balloon)], [Alwen et al.'15,'16a,'16b'16c]
  - 4 out of top 5 in Password Hashing Competition [Argon2, Catena, Lyra2, yescrypt]

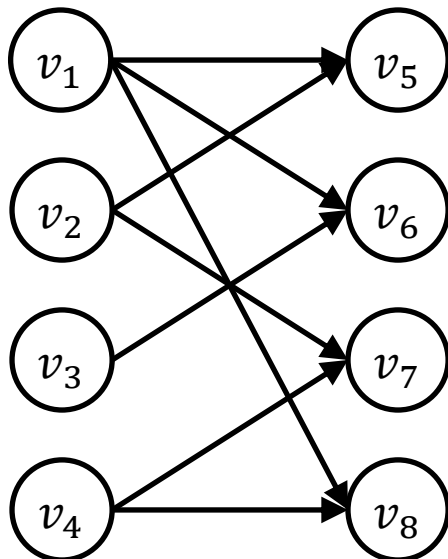
How to Define Memory Hardness?

# A Natural Definition

- A MHF  $f(x)$  is computable with  $N$  space
  - Not computable with  $S < N$  space [DKW'11]
  
- Remark: Assume random oracle  $H$

# Graph Pebbling

- Evaluate  $H$  in a DAG
  - “not computable” = “have to guess output of  $H$ ”
  - $T = \#$  calls to  $H$



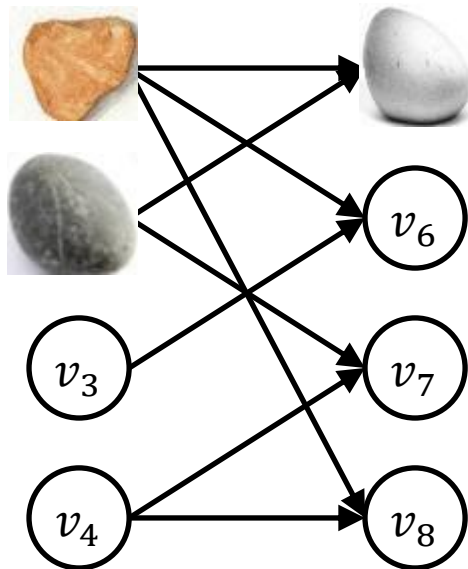
$$v_5 = H(5 \mid v_1 \mid v_2)$$

$$v_6 = H(6 \mid v_1 \mid v_3)$$

.....

# Graph Pebbling

- Rule: all predecessors must be pebbled
- Model  $S$ ,  $T$  with pebbles [Dwork et al.'03'05], [DKW'11]



$$v_5 = H(5 \mid v_1 \mid v_2)$$

$$v_6 = H(6 \mid v_1 \mid v_3)$$

.....



# Relax the Strict Definition

- Computable with  $N$  space and  $T$  time
  - Not computable with  $S < N$  space [DKW'11]
  - Infeasible to compute with  $S < cN$  space

- Problem of [DKW'11]:  $T = O(N^2)$
- Infeasible =  $2^k$  calls to  $H$
- $c$ : memory-hardness;  $T$ : efficiency

# Previous and Our Results

Scheme	$T$	$c$
DKW	$O(N^2)$	1
PoSE	$O(N \log^2 N)$	1/32
Catena2	$O(kN \log N)$	1/20
Balloon	$O(kN)$	1/8 $\rightarrow$ 1 stacked expanders

# Other Definitions & Properties



Memory hard at most steps, not just at some step [AS'15]



Lower bounding  $ST = \Omega(N^2)$

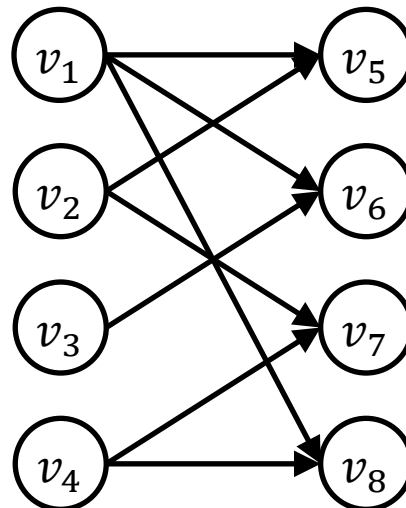


Security against infinite parallelism [AS'15]

# Construction from Stacked Expanders

# Expander

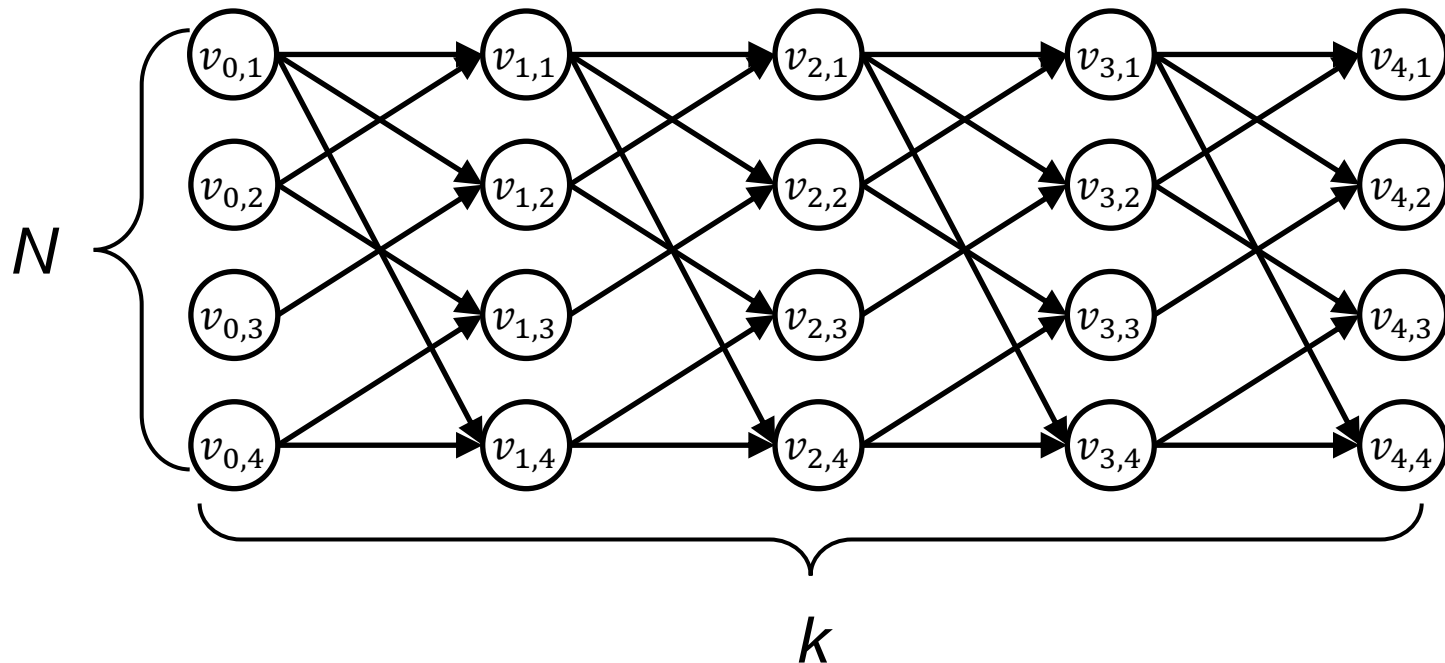
- $(N, \alpha, \beta)$  bipartite expander ( $0 < \alpha < \beta < 1$ )
  - $N$  sources and  $N$  sinks
  - A few sinks ( $\alpha N$ )  $\leftarrow$  many sources ( $\beta N$ )



$(4, 1/4, 1/2)$ -expander

# Stacked Expanders

- $k$  back-to-back  $(N, \alpha, \beta)$ -expanders
- Can be pebbled in  $S = 2N, T = kN$ 
  - [balloon] With modifications  $S = N, T = kN$

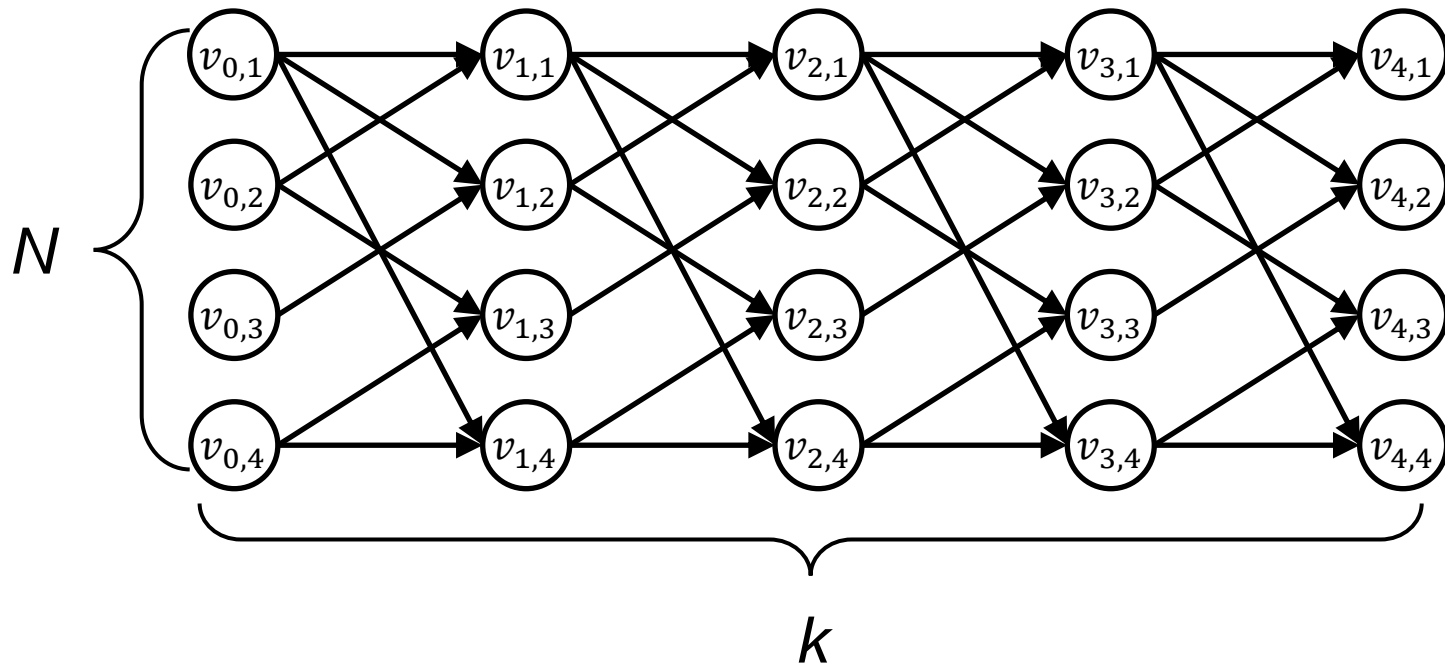


# Stacked Expanders - Lower Bound

- If  $S < (\beta - 2\alpha)N$ ,  $T > 2^k$        $c = (\beta - 2\alpha)$  is tight

– Proof by induction, similar to [Paul & Tarjan'78]

- Hard at most steps



Memory hard  
function



Memory  
hard PoW



Proof of  
space



# Memory Hard PoW

- ASIC-resistant Proof of work
- MHF + cheap verification:  $\text{poly}(k, \log N)$

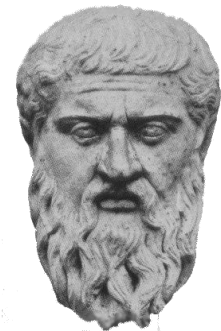
**Verifier**



“I used  $N$  space.  
Here is a proof”



**Prover**

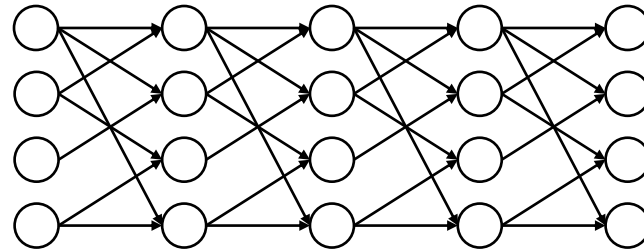


# Memory Hard PoW [ABFG'14]

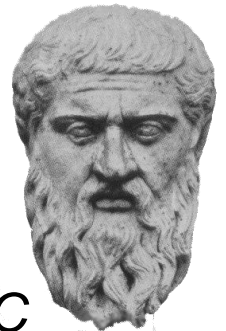
**Verifier**



input  $x$



**Prover**



commit all vertices to a Merkle root  $C$

$C$



**Build the Merkle tree incrementally**

**Check  $O(k^2)$  vertices**

“Let me check  $\{v_i\}$ ”



Merkle paths for each  $v_i$   
and its predecessors



**Rebuild the Merkle**

Check each  $v_i$   
is correctly pebbled

Memory hard  
function



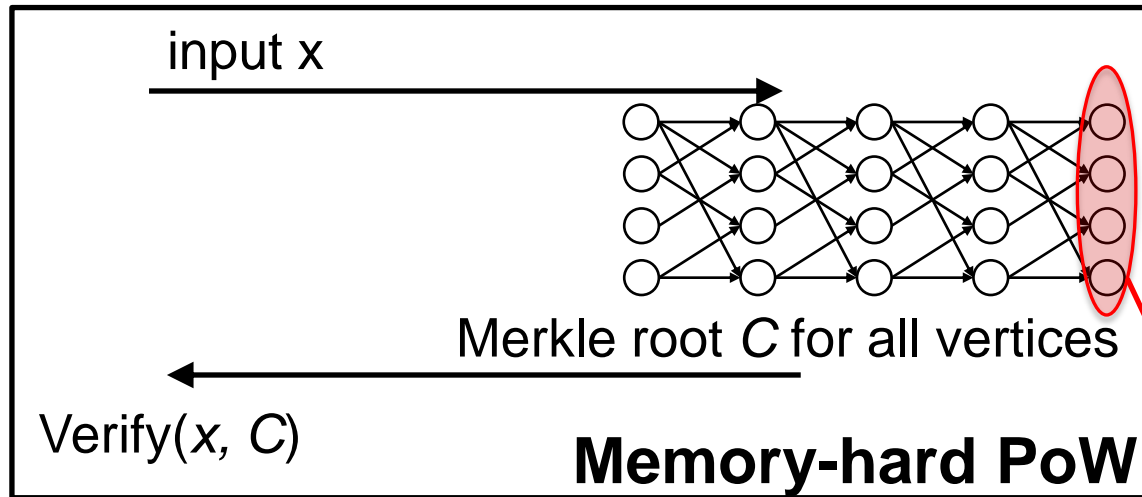
Memory  
hard PoW



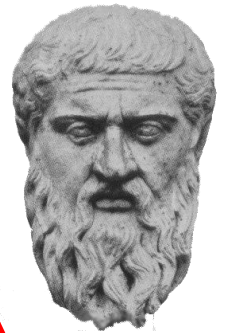
Proof of  
space

# Proof of Space

Verifier

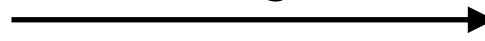


Prover



Y

still storing Y?

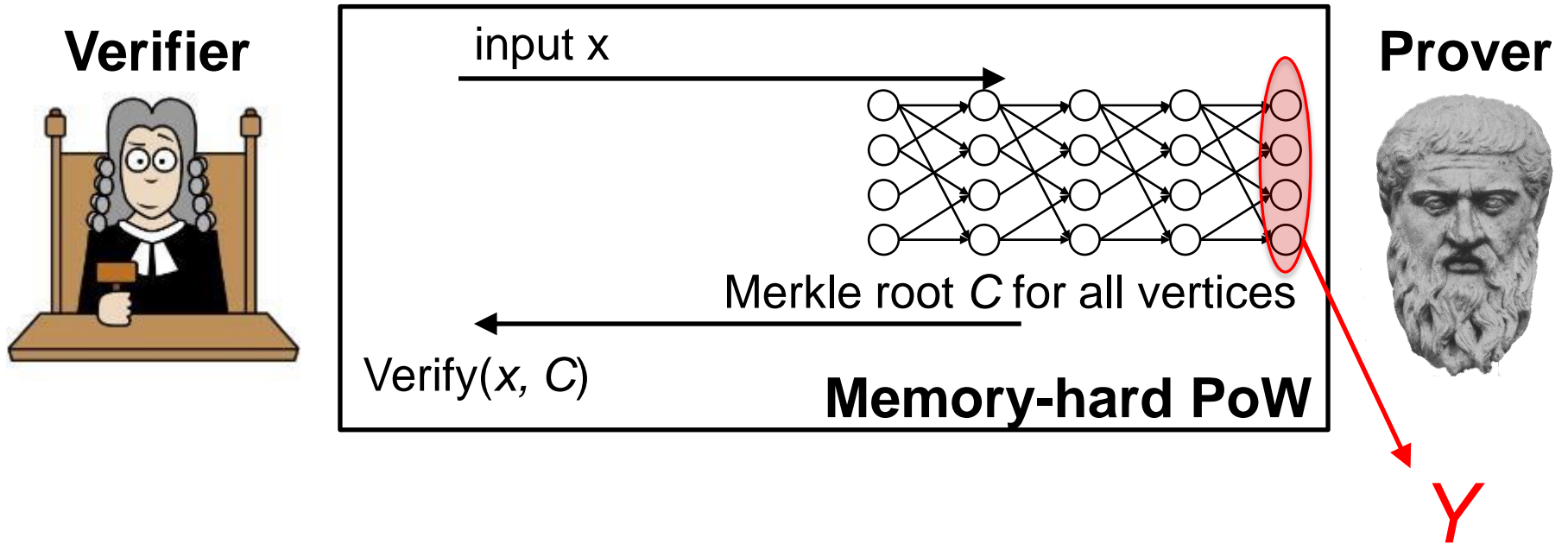


prove yes



If storing Y, trivial to answer  
Otherwise, hard to answer  
Motivation: save energy

# Proof of Space



Check  $O(k)$  sinks

“Let me check  
some sinks  $\{v_i\}$ ”

Merkle paths for  $\{v_i\}$

Check  $\{v_i\}$  against  $C$

## Memory-hard PoW

Scheme	Prover time	V space/time	$c$
ABFG	$O(kN \log N)$	$O(k^2 \log^2 N)$	$\rightarrow 1/6$
<b>This work</b>	<b><math>O(kN)</math></b>	<b><math>O(k^2 \log N)</math></b>	<b><math>\rightarrow 1</math></b>

## Proof of space

Scheme	P time	V space/time	$c$
DFKP	0	$O(k \log N)$	$\rightarrow \frac{1}{2 \times 256 \times 28 \times \log N}$
<b>This work</b>	<b>0</b>	<b><math>O(k \log N)</math></b>	<b><math>\rightarrow 1/2</math></b>

# Summary



- More efficient, and/or
- Stronger memory hardness
  - No big gap, hard at most steps

**Thank you!**