

# Scrypt is Maximally Memory Hard

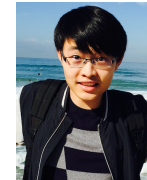
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Boston University

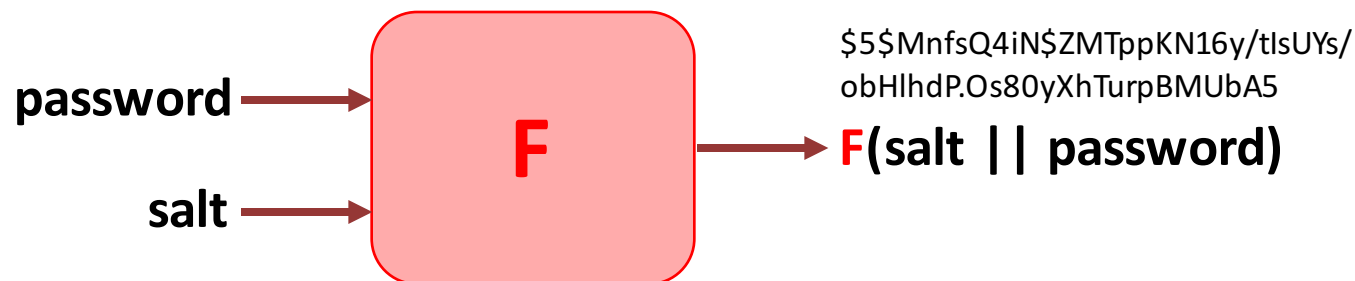


**Stefano Tessaro**

UCSB



**Password hashing:** Store a hash of a password + salt



**F** is moderately hard

Honest users can still login quickly.  
 $\approx 1$  evaluation of **F**

Brute-force attack is infeasible.  
Many evaluations of **F**



Traditional hardness metric: Time complexity (e.g., PKCS #5)

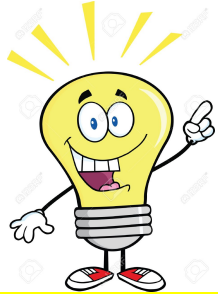
# ASIC-resistance

## Honest users

(General-purpose CPU)



cost per **F** eval =  $C$



better parallelization, pipelining for speedup; lower energy costs ...

## Adversaries

(ASICs)

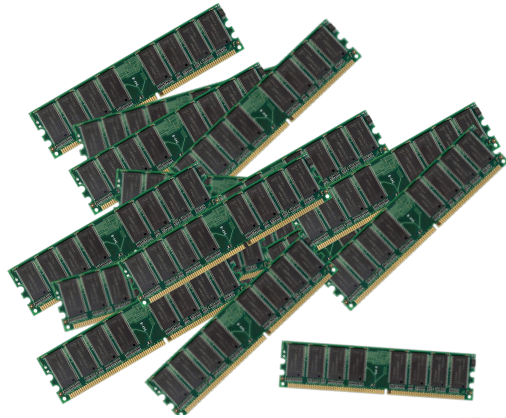


cost per **F** eval =  $C' \ll C$

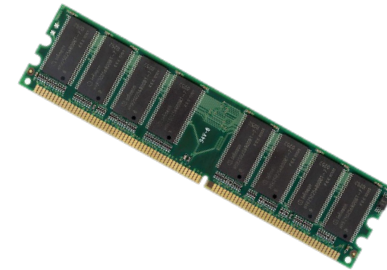
Can we enforce  $C' \approx C$ ?

Idea: Memory costs (e.g., on-chip area, access time, \$-cost) are platform independent

# Memory-hard functions (MHFs) [Percival, 2009]



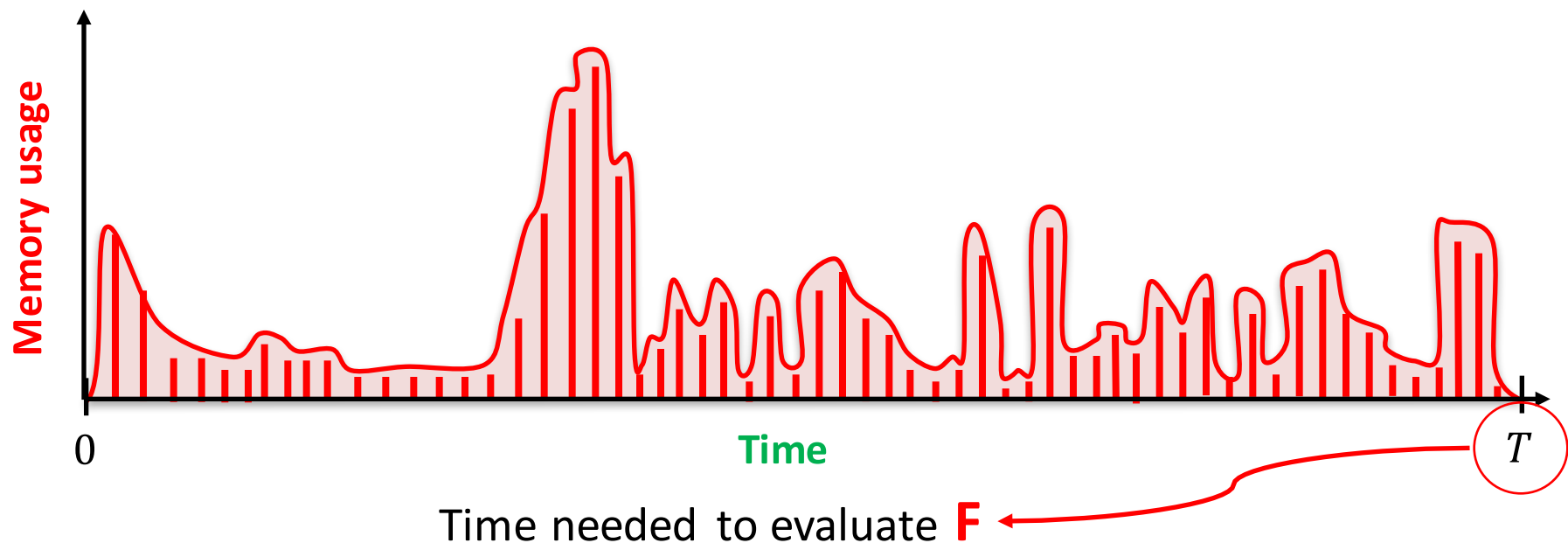
Fast evaluation of **MHF F**  $\Rightarrow$   
large memory



Small memory  $\Rightarrow$   
slow evaluation of **MHF F**

# Memory-hardness, more precisely

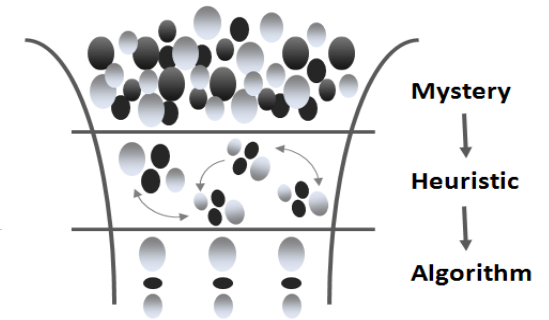
**Goal:** Maximize cumulative memory complexity (CMC) for any (possibly **parallelized**) strategy to evaluate **F**.



$$\text{CMC} = \sum_{t=0}^T \text{Memory}(t)$$

[Alwen and Serbinenko, STOC '15]

# Memory-hardness



## PHC call for submissions

The Password Hashing Competition (PHC) organizers solicit proposals from any interested party for candidate password hashing schemes, to be considered for inclusion in a portfolio of schemes suitable for widespread adoption, and covering a broad range of applications.

Memory-hardness was de-facto requirement for PHC

### Security

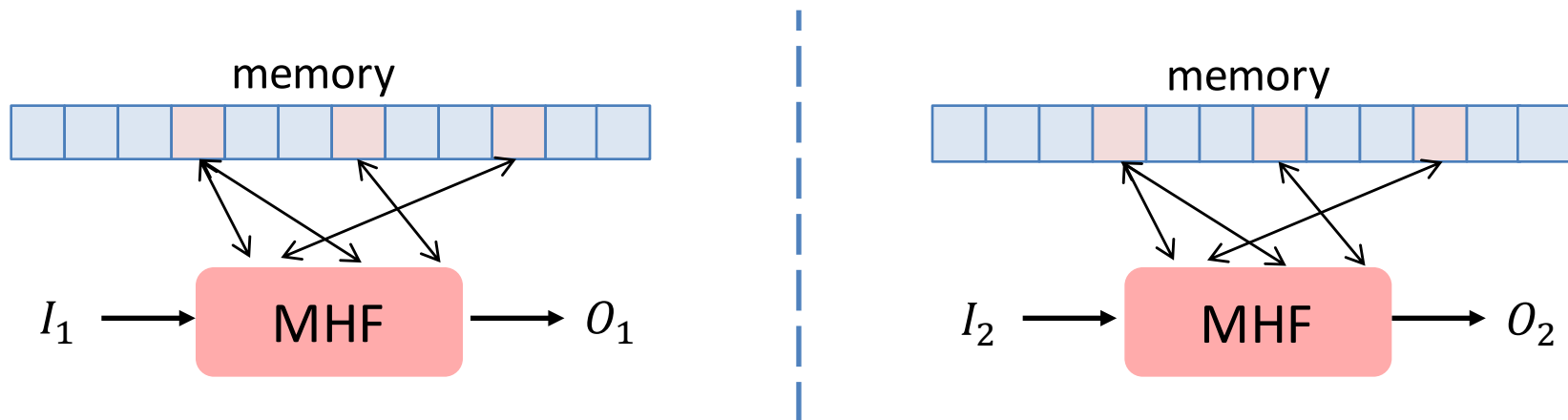
- Cryptographic security: the function should behave as a random function (random-looking output, one-way, collision resistant, immune to length extension, etc.).
- Speed-up or other efficiency improvement (e.g., in terms of memory usage per password tested) of cracking-optimized implementations (checking multiple sets of inputs in parallel, and doing so in a CPU's native code) compared to implementations intended for password validation should be minimal.
- Speed-up or other efficiency improvement (e.g., in terms of area-time product per password tested) of cracking-optimized ASIC, FPGA, and GPU implementations (checking multiple sets of inputs in parallel) compared to CPU implementations intended for password validation should be minimal.
- Resilience to side-channel attacks (timing attacks, leakages, etc.). In particular, information should not leak on a password's length.

Many memory-hard candidates: Argon2d, Argon2i, Scrypt, Lyra2, Balloon hashing, Catena, Yescript, .....

Can we build provably memory-hard functions?

# Towards optimal memory hardness

Previous provably MHFs [AS15,BCS16,ABP17] are iMHFs: data-independent memory access patterns!



Two issues raised by Alwen and Blocki:

(1) No **iMHF** achieves optimal memory hardness.

(2) Practical iMHFs are even less memory hard for parallel evaluation strategies.

Can data-dependence help? 

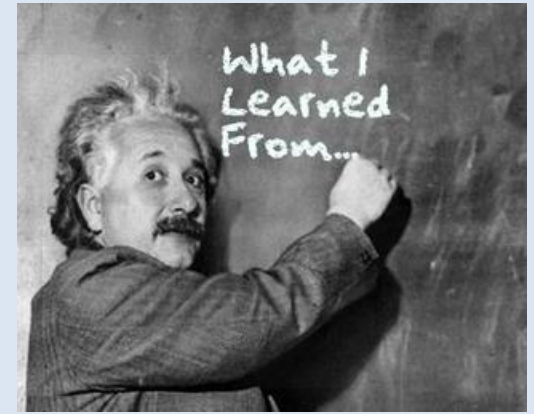
## This paper: Scrypt is **optimally** memory hard

- Very first conjectured MHF: Proposed by **Colin Percival** in **2009**
- Used within PoWs in **Litecoin**
- Inspired the design of **Argon2d** – one of the winners of Password Hashing Competition
- Covered by RFC 7914



## Take home message:

Very **first** example of function with provably optimal memory hardness.



+ it is practical, already in use, and relatively simple

Finding such proof has been a surprisingly hard problem:

- [Percival, 2009] is incorrect
- [ACKKPT16] only gave restricted result



No **iMHF** achieves optimal memory hardness

# Roadmap

## 1. The Scrypt function

Definition, memory-hardness intuition, and challenges

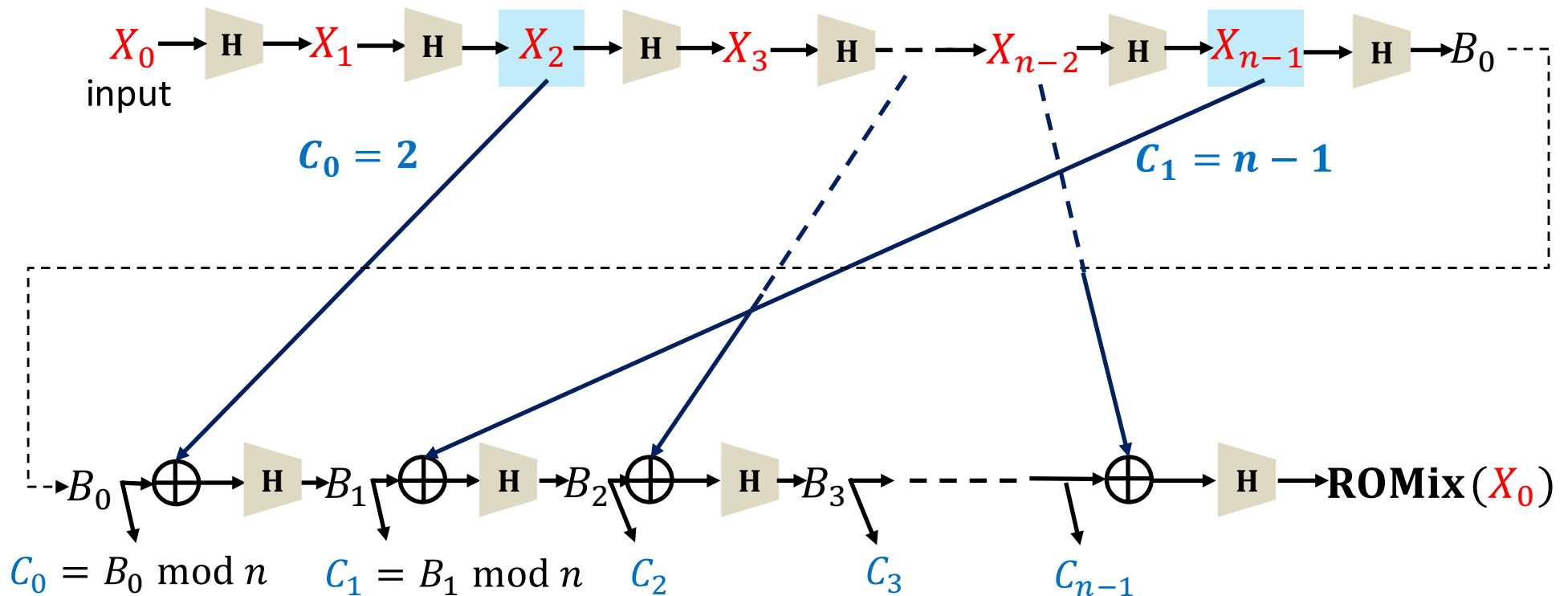
## 2. Optimal memory hardness of Scrypt

## 3. Conclusions



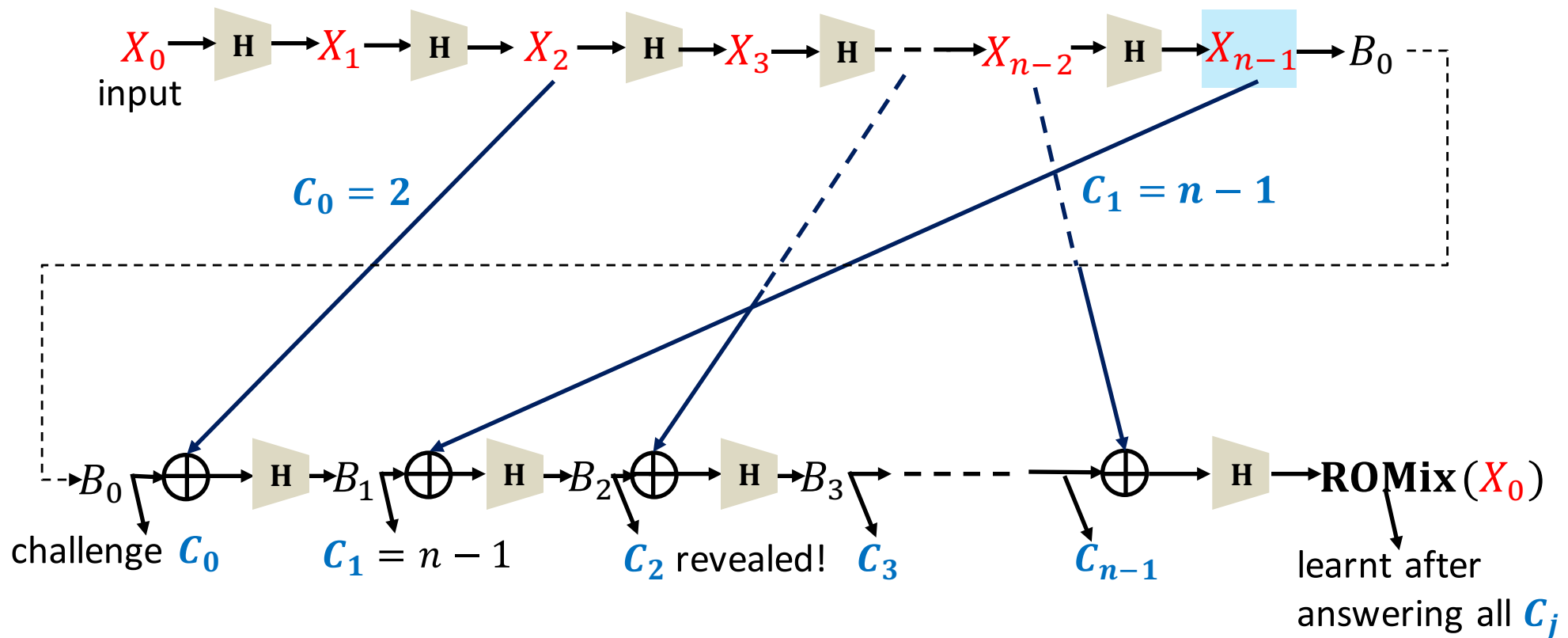
# Core of Script: ROMix

Modeled as a **random oracle**!  $\longrightarrow$  **H**: A Salsa20 based “hash function” with output length **w**.



$n$ : a tunable parameter.  
e.g.,  $n = 2^{14}$ ,  $w = 1$  KB

# ROMix: Answering challenges

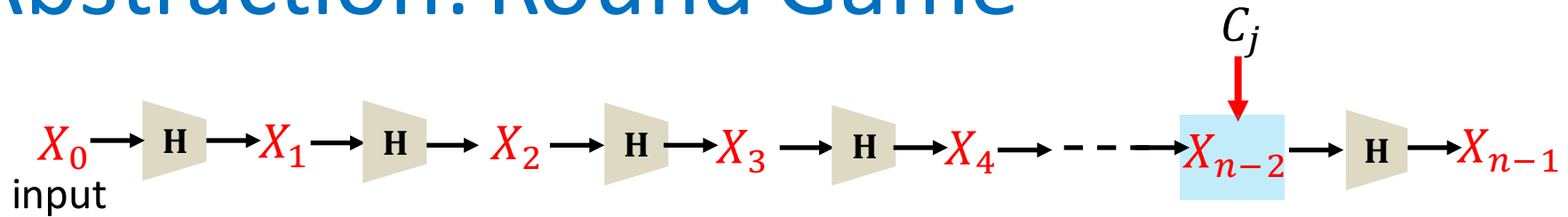


$C_0, C_1, \dots, C_{n-1}$  **unpredictable challenges:**

1. Need to know  $X_{C_j}$  to learn  $C_{j+1}$
2. Need to answer all challenges to complete the evaluation

**Useful to abstract this!**

# Abstraction: Round Game

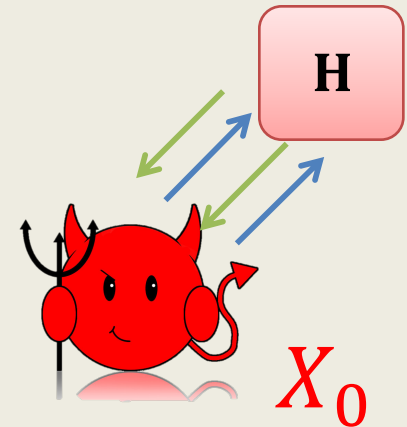
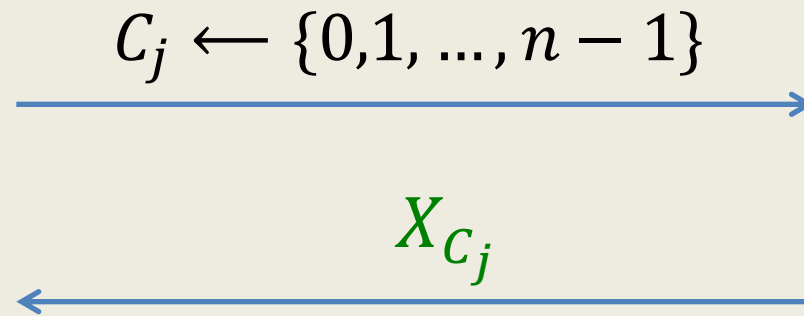


Abstract 2<sup>nd</sup> phase: challenges are ~~H~~ dependent random!

For all round  $j = 0, \dots, n - 1$ :



Challenger



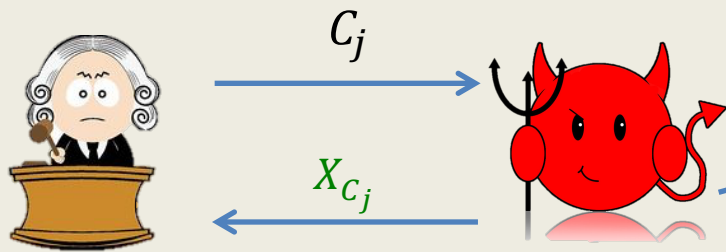
Adversary

Adversary's goal: Reduce its own CMC for answering all challenges!

$$\text{CMC} = \text{Cumulative Memory Complexity} = \sum_{t=0}^T \text{Memory}(t)$$

# Round game – Naïve strategy

For round  $j = 0$  to  $n - 1$ :



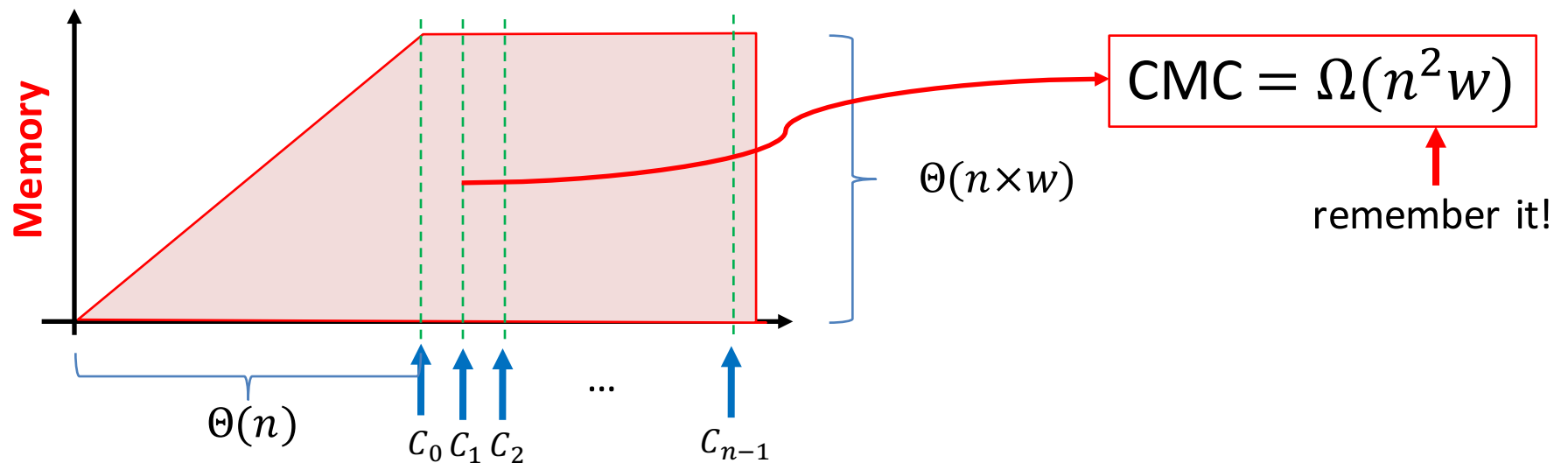
**Init:**

$\text{Mem}[0] \leftarrow X_0$

**for**  $i = 1, \dots, n$  **do**

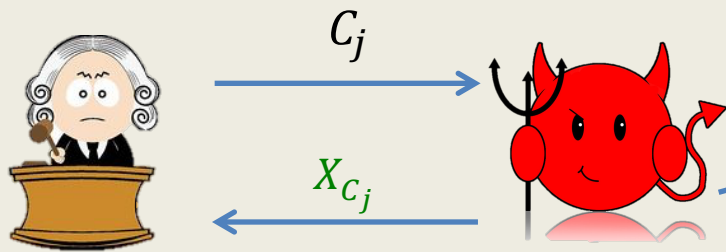
$\text{Mem}[i] \leftarrow \mathbf{H}(\text{Mem}[i - 1])$

**Upon challenge**  $C_j$ : **return**  $\text{Mem}[C_j]$



# Round game – Memory-less strategy

For round  $j = 0$  to  $n - 1$  :

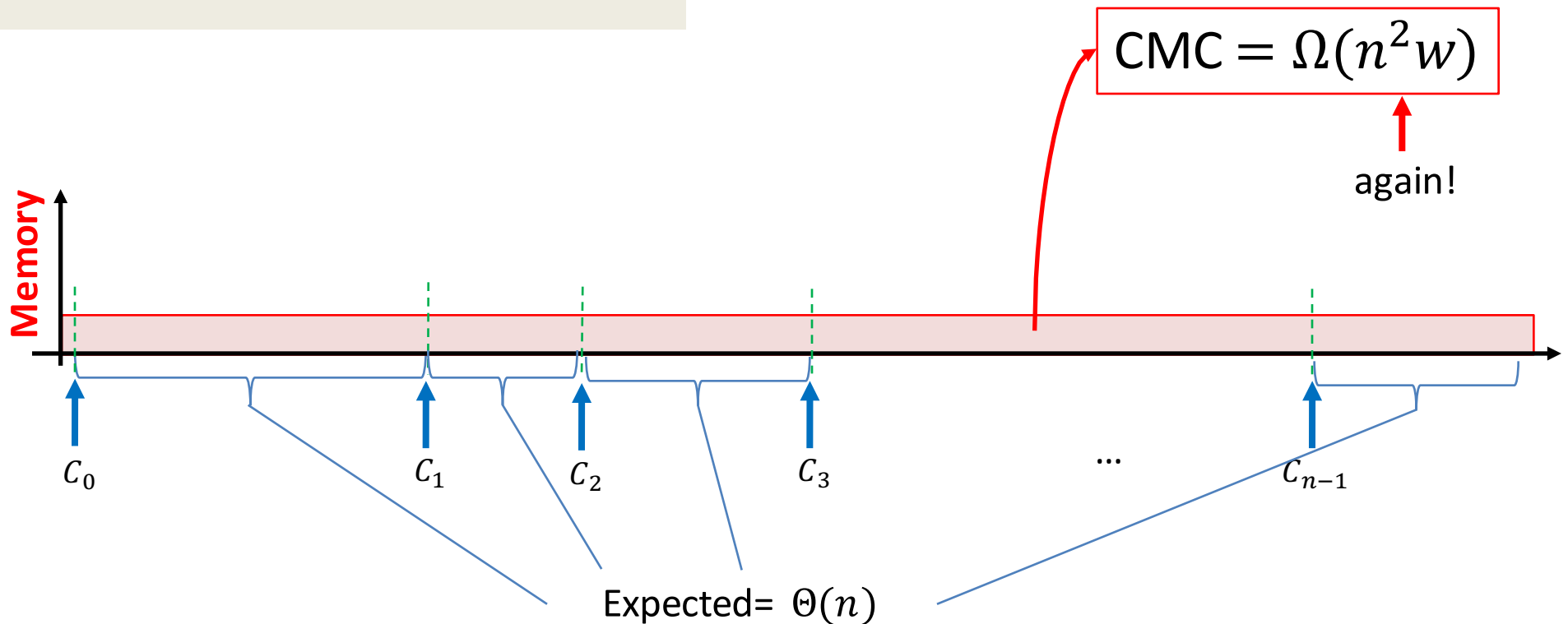


Upon challenge  $C_j$ :

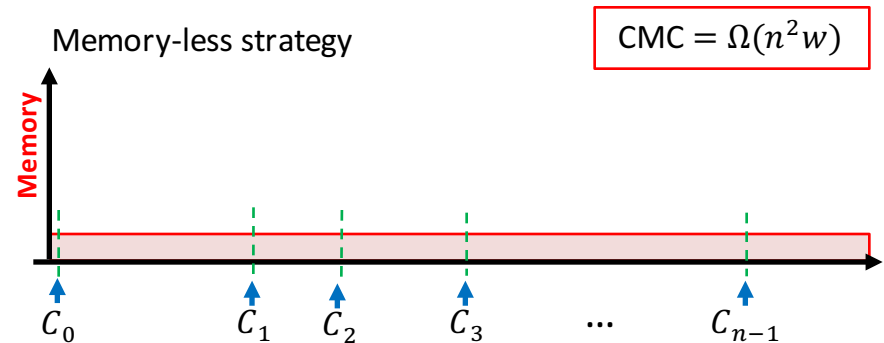
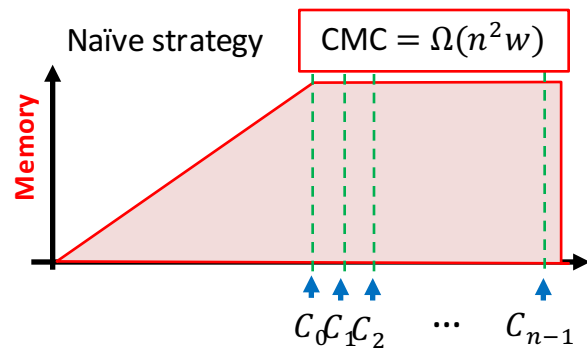
$X = X_0$

for  $i = 1, \dots, C_j$  do  $X \leftarrow \mathbf{H}(X)$

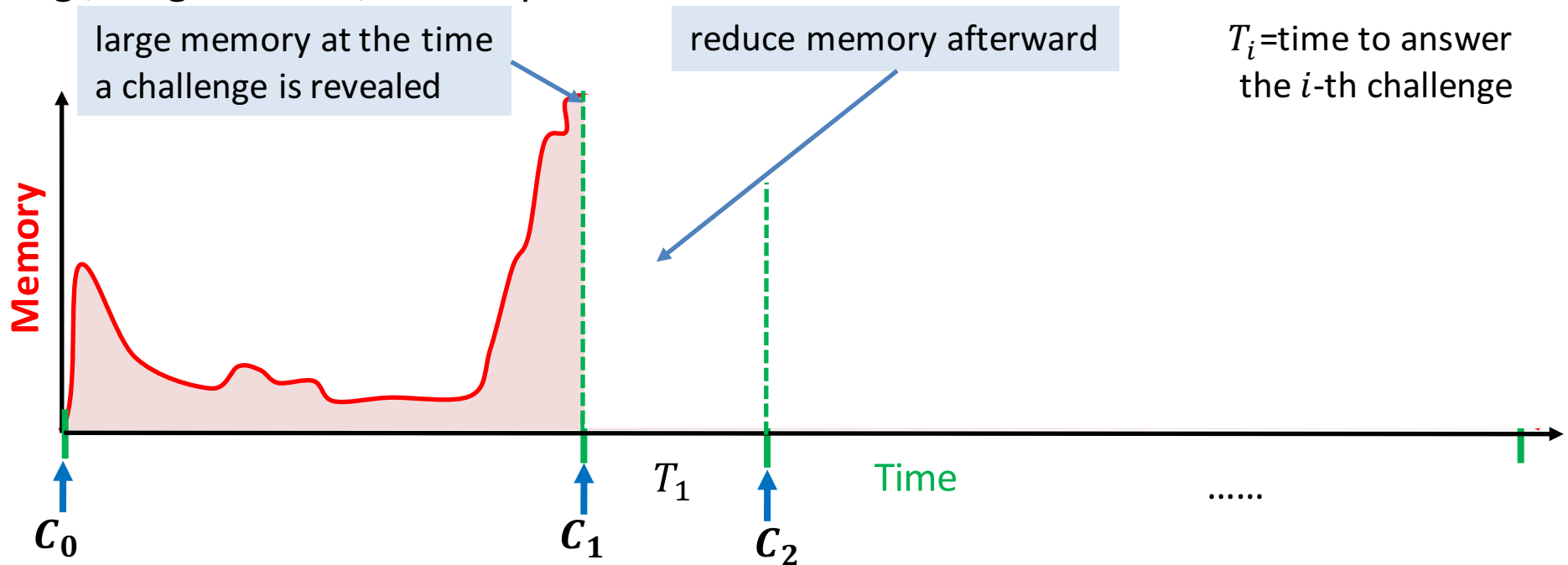
return  $X$



Previous two strategies are special cases: consistent memory size



More general strategy: memory consumption can vary a lot  
e.g., forget values, re-compute afterward

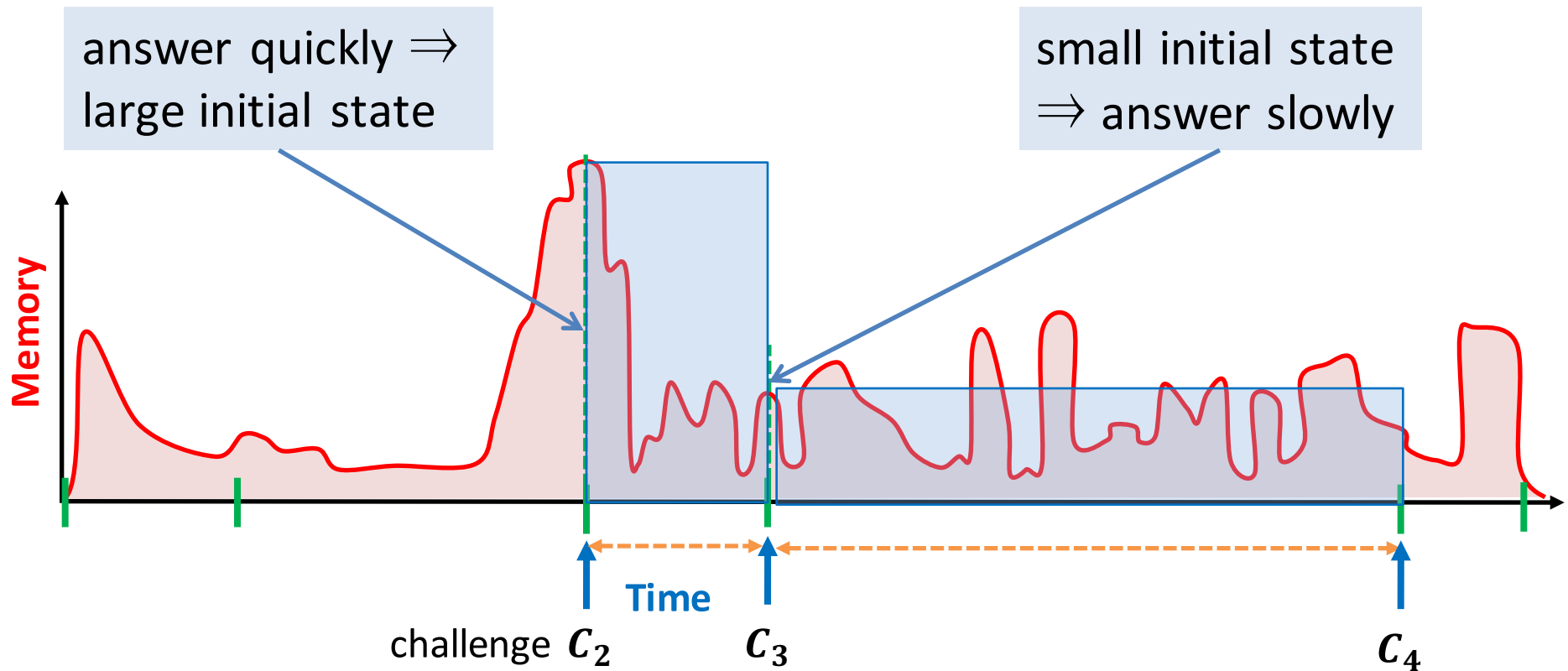
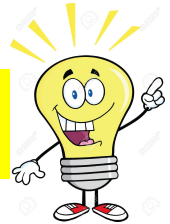


**Goal:** prove  $\text{CMC} = \Omega(n^2 w)$ !



# Memory hardness: intuition

**Intuition:** Answering challenge fast requires large state!

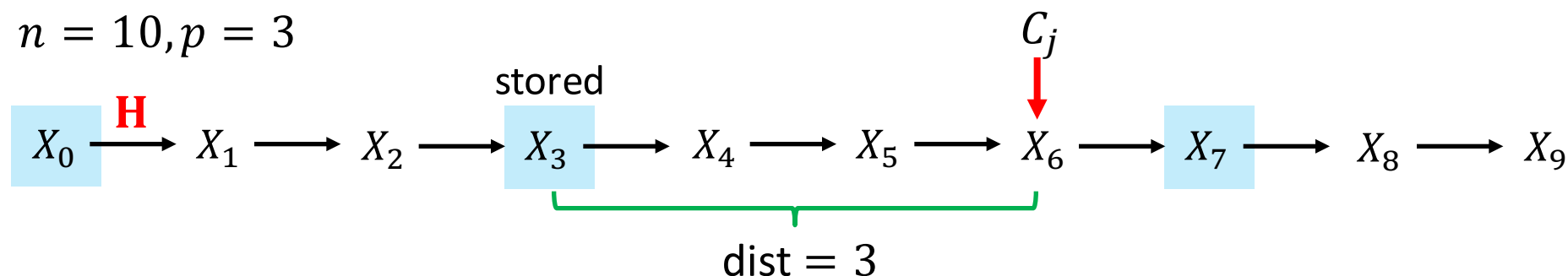


# Single-shot memory-time trade-off

**Simplifying assumption:** upon learning challenge  $C_j$ , adversary only stores  $p$  of the values  $X_0, \dots, X_{n-1}$



$n = 10, p = 3$



**Fact:** Avg-distance from  $X_{C_j}$  to closest stored  $X_i$  preceding  $X_{C_j}$  is  $n/2p$

Regardless of parallelism, as computation of  $X$ -values is inherently sequential!

Expected time to answer the challenge is  $n/2p$

$\approx |\text{memory}|$

How to translate this intuition into a memory-hardness proof for ROMix?

Three technical barriers:

1. Adversary stores arbitrary information  
e.g., XOR of  $X_i$  values, halves of  $X_i$ , reconstruct information adaptively on challenges, etc.

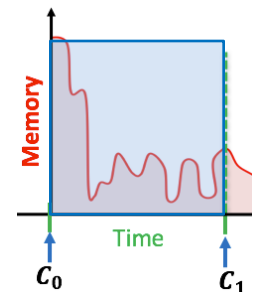
[ACKKPT16] considered restricted strategies and exhibited round games where general storing strategies can help!

2. Memory variation during computation  
single-shot memory-time trade-off not enough!

[ACKKPT16] only shows  $\text{CMC} = \Omega\left(\frac{n^2 w}{\log^2(n)}\right)$

3. **H**-dependent challenges, as opposed to truly random **see the paper!**

**Focus on  
1 and 2**



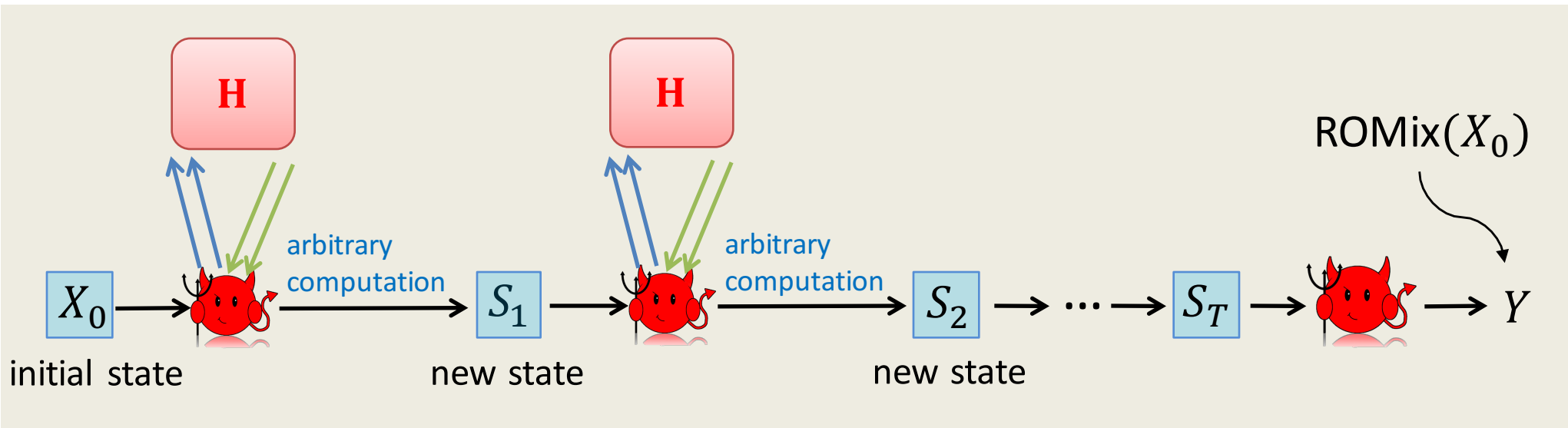
# Roadmap

1. The Script function
2. Optimal memory hardness of Script  
Model, theorem, and proof approach
3. Conclusions



# The parallel random oracle model

[Alwen and Serbinenko, STOC '15]



**At each step:** Adv asks one batch of parallel **H** queries + performs unbounded computation

Goal of adv: minimize **CMC** =  $\sum_{i=1}^T |S_i|$

## Main Theorem.

For any adversary **A** evaluating **ROMix**,

$$\text{CMC}(\mathbf{A}) \geq \frac{1}{25} \cdot n^2 \cdot (w - 4 \cdot \log(n))$$

w/ overwhelming probability over the choice of **H**.

The  $4\log(n)$  loss is inherent in the proof.

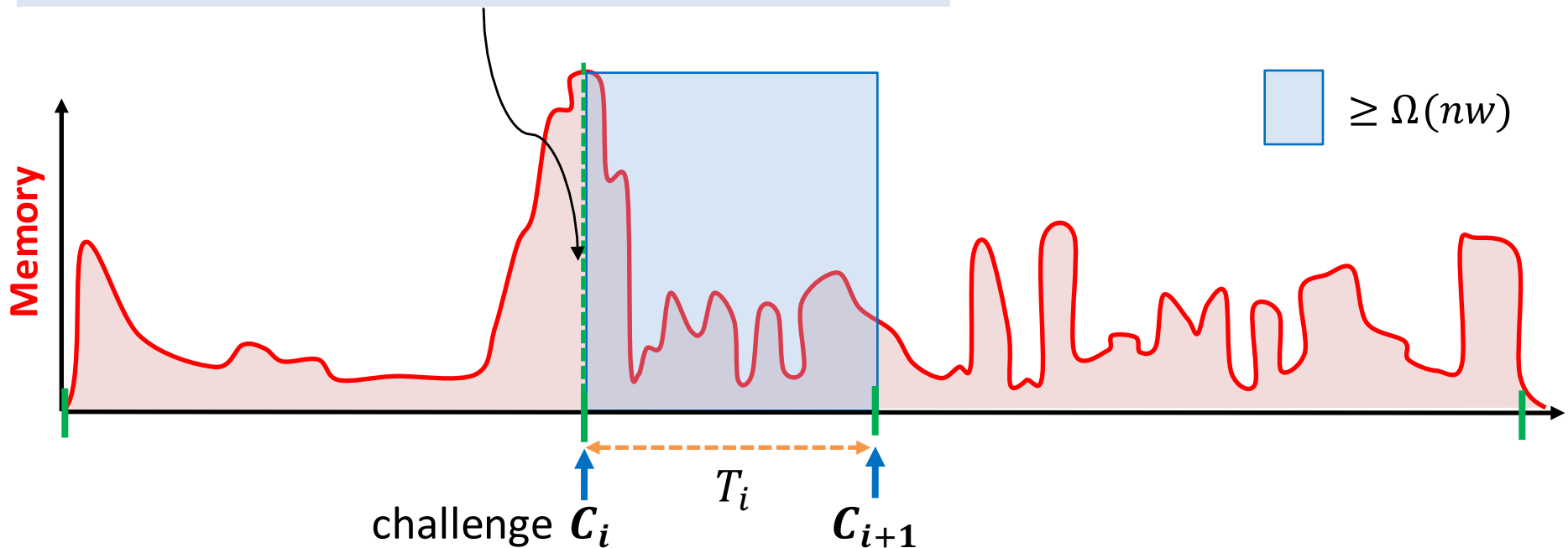
$\Omega(n^2 w)$  clearly best possible for any construction making  $n$  queries to **H**.

Naïve strategy: Make  $n$  calls, remember all outputs

# Proof strategy: step 1

Green (memory usage at this step)  
is inversely proportional to orange ( $T_i$ )

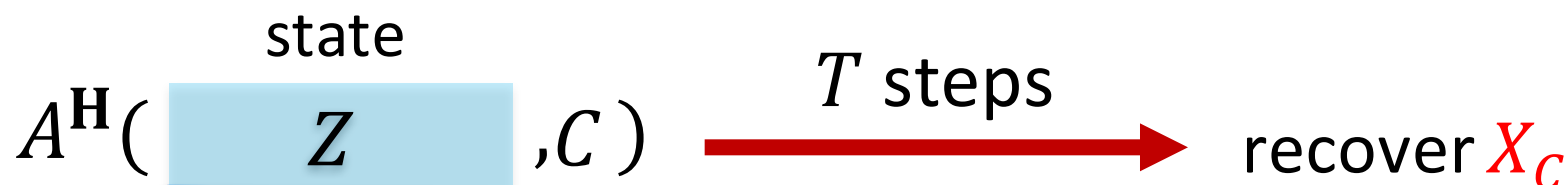
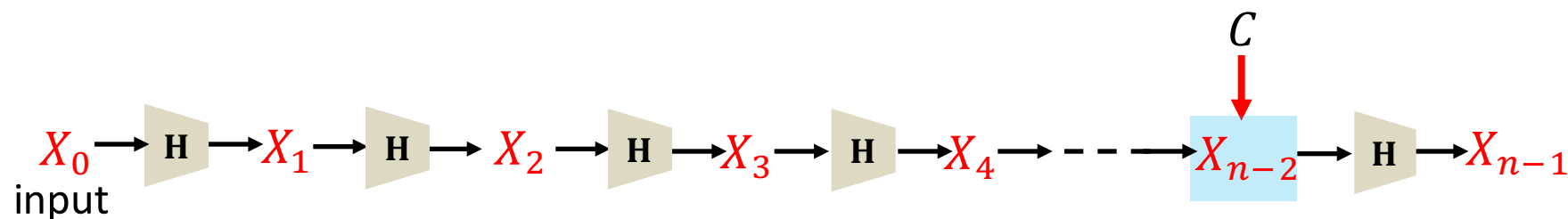
$T_i$  = time to answer the  
 $i$ -th challenge



**Memory-time trade-off  $\Rightarrow$  lower bound on memory**

The memory-time trade-off holds true for adv ~~storing  $X$ -values~~  
even if the adv stores arbitrary information!

# Single-shot memory-time trade-off



$Z$ : arbitrary computation on  $H$ -outputs

- E.g., pre-computation of  $H$ 's entries, XOR of  $\{X_i\}$  values, halves of  $X_i$

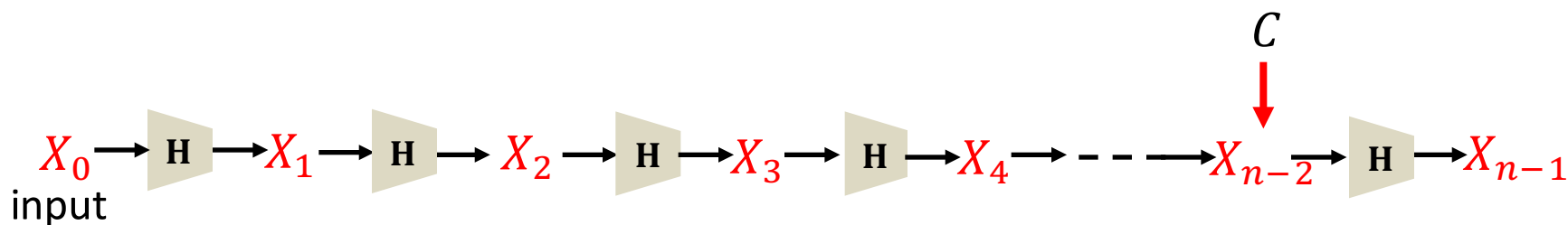
Goal: Lower bound  $|Z|$  as function of  $T$  and  $n$

**[ACKKPT16]:** computation on  $H$ -outputs can help in some round games

**[This result]:** computation on  $H$ -outputs cannot help for Scrypt!



# Single-shot memory-time trade-off



$$A^H(\text{Z}, C) \xrightarrow{T \text{ steps}} \text{recover } X_C$$

**Lemma.** For all  $A$ , for most  $H$ , if  $|Z| \approx pw$  bits

$$\Pr_c \left[ T > \frac{n}{2p} \right] > \frac{1}{2}$$

**Lemma.** For all  $A$ , for most  $\mathbf{H}$ , if  $|Z| \approx pw$  bits

$$\Pr_c \left[ T > \frac{n}{2p} \right] > \frac{1}{2}$$

Proof idea:

If adversary  $A^{\mathbf{H}}(Z, C)$   
answers too fast for  
most challenges  $C$



$A^{\mathbf{H}}(Z, C)$  can output or  
query many  $X_i$  values  
w/o querying  $\mathbf{H}$  first



Can compress the oracle  
 $\mathbf{H}$  using state  $Z$

Cannot be true for too many  $\mathbf{H}$ : random oracle is incompressible

[Dwork, Naor and Wee, Crypto'05], [Alwen and Serbinenko, STOC '15]

# Proof strategy: step 2

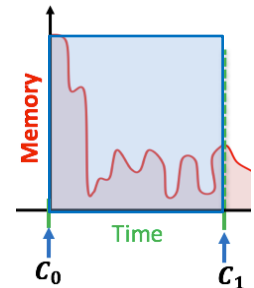
## Technical barriers:

1. Adversary stores arbitrary information



Single-shot memory-time trade-off for arbitrary adv

2. Memory variation during computation



Single-shot  
memory-time  
trade-off

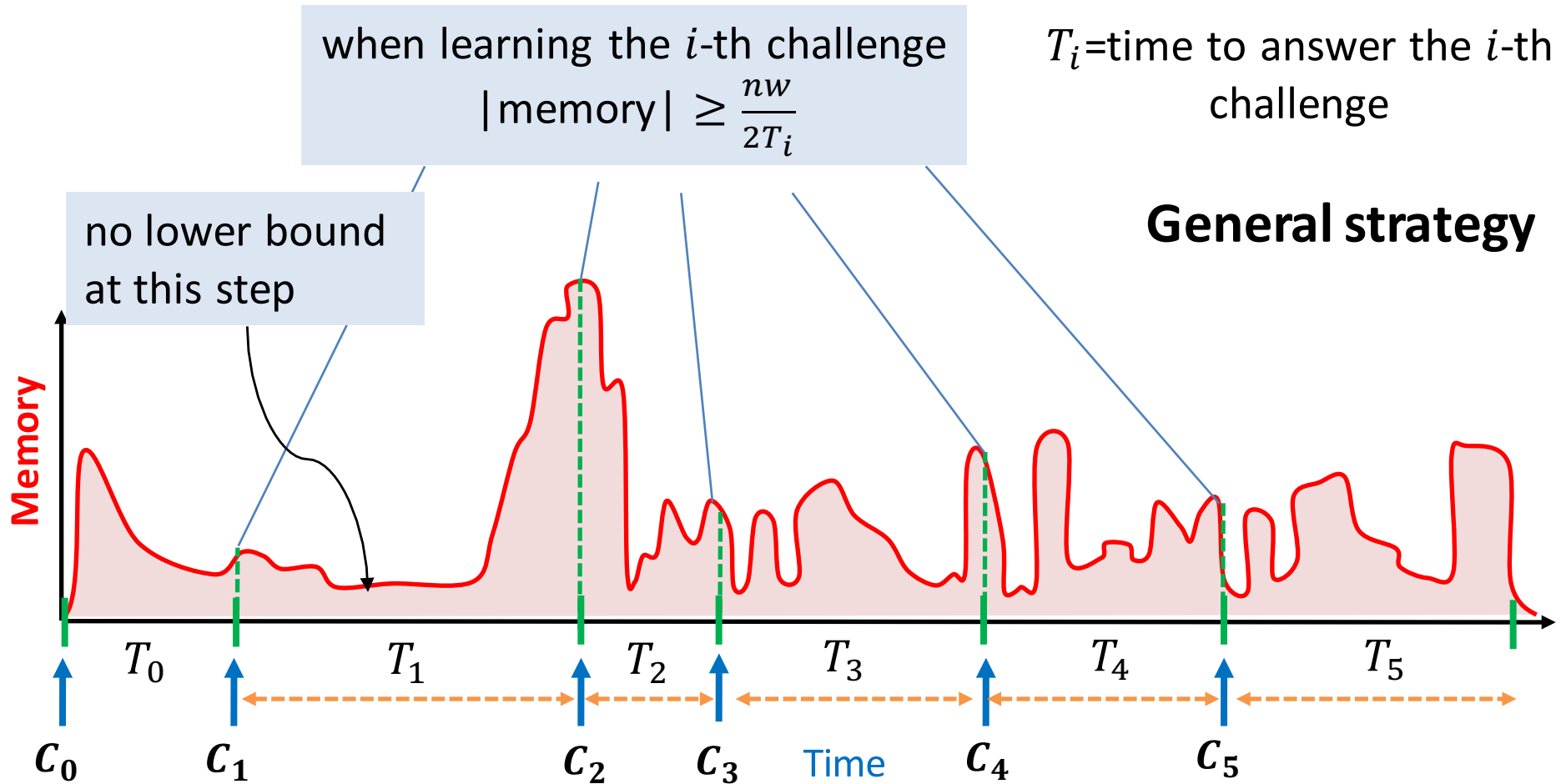


Optimal **CMC**  
lower bound for  
the round game

↑  
**Generalize**

# CMC lower bound

**Lemma.**  $\Pr_C \left[ p > \frac{n}{2T} \right] > \frac{1}{2}$



memory-time trade-off  $\Rightarrow$  memory lower bound  
for the step right before the challenge is revealed

CMC = ???

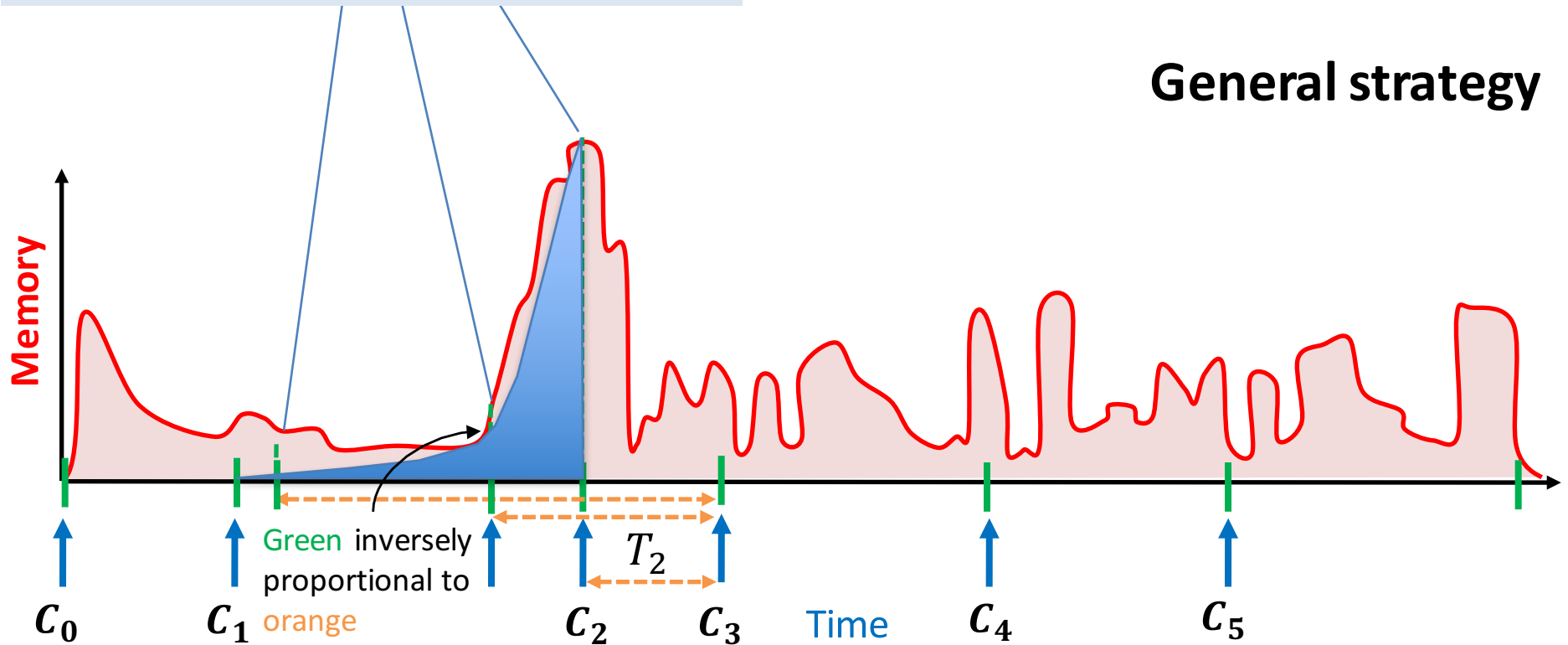
# CMC lower bound

**Lemma.**  $\Pr_C \left[ p > \frac{n}{2T} \right] > \frac{1}{2}$

mem at every step  $\geq$  funcs of  $n$  and **time** to answer the next challenge

$T_i$  = time to answer the  $i$ -th challenge

**General strategy**



Similar trade-off holds for every step before challenge is revealed

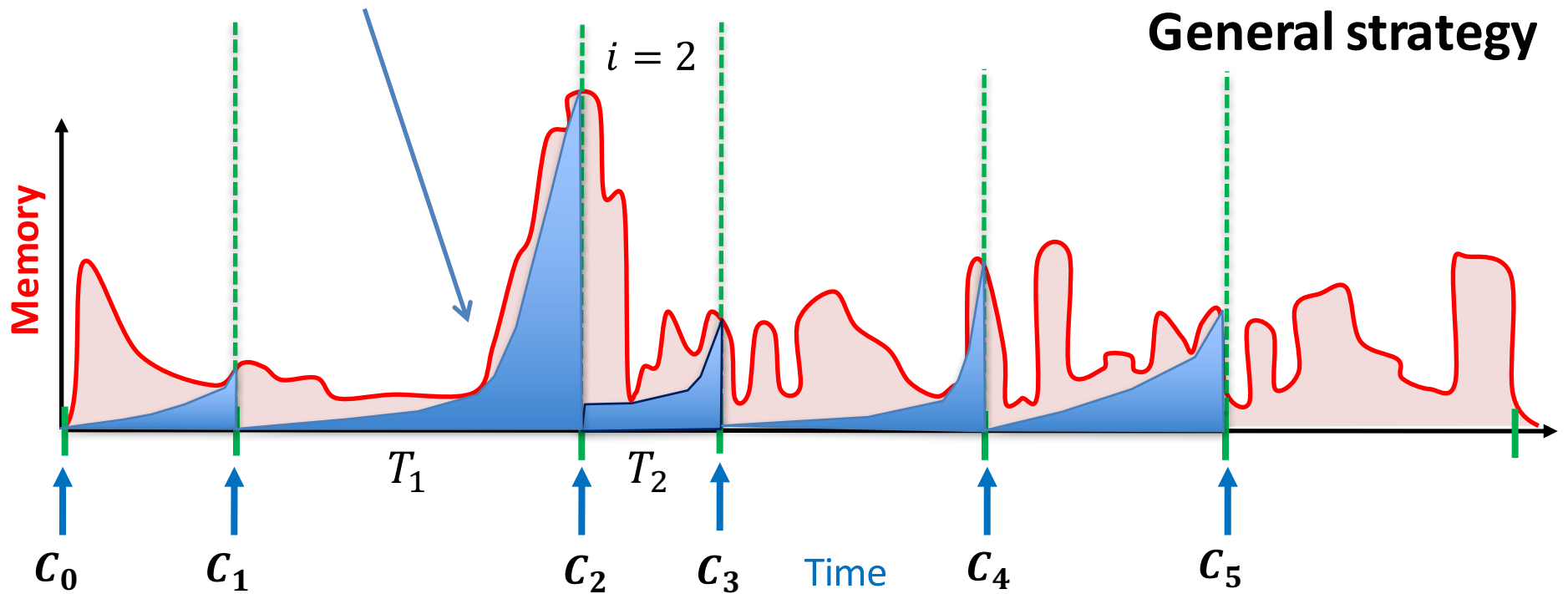
# CMC lower bound

**Lemma.**  $\Pr_C \left[ p > \frac{n}{2T} \right] > \frac{1}{2}$


During round  $i - 1$ :

$$\text{Sum of memory} \geq \frac{nw}{2} \ln \left( 1 + \frac{T_{i-1}}{T_i} \right)$$

$T_i$  = time to answer the  $i$ -th challenge



By adding lower bounds over rounds from 0 to  $n - 1$ , we have  $\text{CMC} = \Omega(n^2 w)$

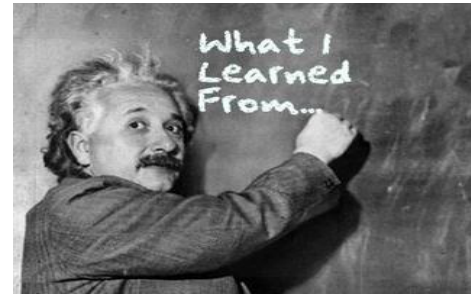
  $= \Omega(n^2 w)$

# Roadmap

1. The Script function
2. Optimal memory hardness of Script
3. Conclusions



# Summary



- Script is **maximally** memory hard
  - First optimal memory-hardness proof.
  - Validates a practical MHF design.
- Open problem
  - Optimal memory hardness proof for **Argon2d**?



**Thank you! – Merci!**

<https://eprint.iacr.org/2016/989>