

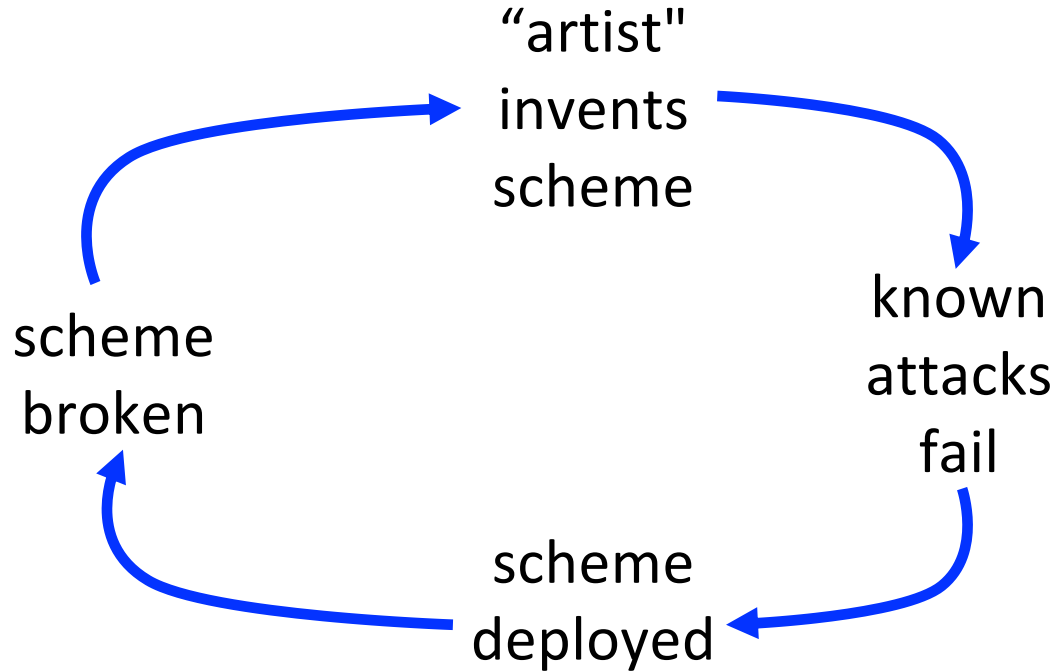
# On **One-way Functions** and **Kolmogorov Complexity**

Rafael Pass  
Cornell Tech

Joint work with Yanyi Liu

# The “Dark Ages” Crypto Cycle

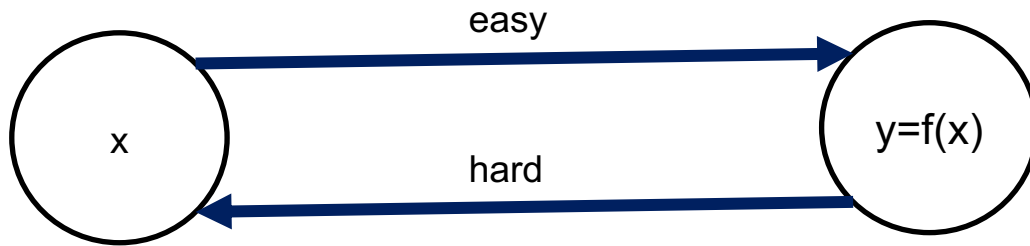
(the last 2000 years)



# One-way Functions (OWF) [Diffie-Hellman'76]

A function  $f$  that is

- **Easy to compute:** can be computed in poly time
- **Hard to invert:** no PPT can invert it

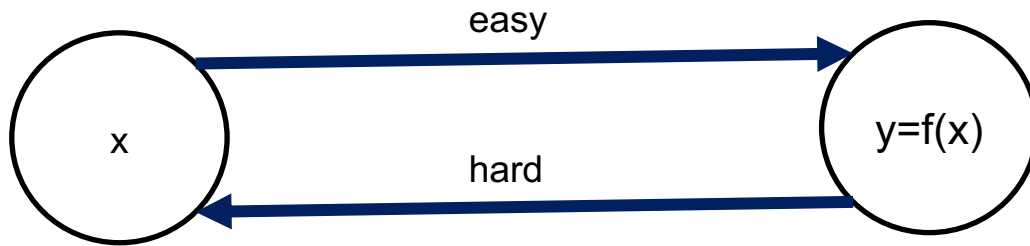


**Ex [Factoring]:** use  $x$  to pick to 2 random “large” primes  $p, q$ , and output  $y = p * q$

# One-way Functions (OWF) [Diffie-Hellman'76]

A function **f** that is

- **Easy to compute:** can be computed in poly time
- **Hard to invert:** no PPT can invert it



**Definition 2.1.** Let  $f : \{0, 1\}^* \rightarrow \{0, 1\}^*$  be a polynomial-time computable function.  $f$  is said to be a one-way function (OWF) if for every PPT algorithm  $\mathcal{A}$ , there exists a negligible function  $\mu$  such that for all  $n \in \mathbb{N}$ ,

$$\Pr[x \leftarrow \{0, 1\}^n; y = f(x) : \mathcal{A}(1^n, y) \in f^{-1}(f(x))] \leq \mu(n)$$

# One-way Functions (OWF) [Diffie-Hellman'76]

A function **f** that is

- **Easy to compute:** can be computed in poly time
- **Hard to invert:** no PPT can invert it

**OWF both necessary [IL'89] and sufficient for:**

- Private-key encryption [GM84,HILL99]
- Pseudorandom generators [HILL99]
- Digital signatures [Rompel90]
- Authentication schemes [FS90]
- Pseudorandom functions [GGM84]
- Commitment schemes [Naor90]
- Coin-tossing [Blum'84]
- ZK proofs [GMW89]
- ...



**Not included:**

public-key encryption, OT, obfuscation

**Whether OWF exists is the most important problem in Cryptography**

# OWF v.s NP Hardness

**Observation:**  $OWF \Rightarrow NP \notin BPP$

**“Holy grail” [DH’76]**

**Prove:**  $NP \notin BPP \Rightarrow OWF$



Lots of **partial** BB “separations”: [Bra’79],[AGGM’06],[P’07],[MX’10]

# In the absence of the holy-grail...

~~Discrete Logarithm Problem [DH'76]~~

~~Factoring [RSA'83]~~

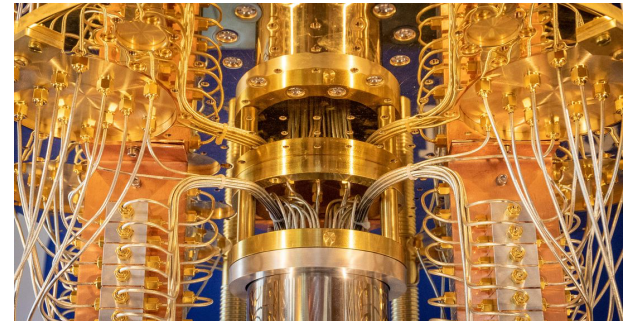
Lattice Problems [Ajtai'96]

DES,  
SHA,  
AES...

So far, not broken...but for how long?  
*"Cryptographers seldom sleep well" - Micali'88*

Have we really escaped from the "crypto cycle"?

**QUANTUM COMPUTERS**



# In the absence of the holy-grail...

Discrete Logarithm Problem [DH'76]

Factoring [RSA'83]

Lattice Problems [Ajtai'96]

DES,  
SHA,  
AES...

**Central question:** Does there exist some **natural average-case hard problem** (a “mother problem”) that **characterizes existence of OWF?**



# Main Theorem

For every polynomial  $t(n) > 1.1n$ :

**OWFs** exist iff  **$t$ -bounded Kolmogorov-complexity** is mildly hard-on-average

# Kolmogorov Complexity [Sol'64,Kol'68,Cha'69]

Which of the following strings is more “random”:

- 1231231231231231231
- 1730544459347394037

$K(x)$  = length of the shortest program that outputs  $x$

Formally, we fix a universal TM  $U$ , and are looking for the length of the shortest program  $\Pi = (M,w)$  s.t.  $U(M,w) = x$

Lots of amazing applications (e.g., Godel's incompleteness theorem)  
But **uncomputable**.

# Time-Bounded Kolmogorov Complexity

Which of the following strings is more “random”:

- 1231231231231231231
- 1730544459347394037

$K(x)$  = length of the shortest program that outputs  $x$

$K^t(x)$  = length of the shortest program that outputs  $x$  within time  $t(|x|)$

Can  $K^t$  be **efficiently computed** when  $t(n)$  is a polynomial?

- Studied in the Soviet Union since 60s [Kol'68,T'84]
- Independently by Hartmanis [83], Sipser [83], Ko [86]
- Closely related to **MCSP** (Minimum Circuit Size Problem) [T'84,KC'00]

# Average-case Hardness of $K^t$

**Frequential version** [60's, T'84]

Does  $\exists$  algorithm that computes  $K^t(x)$  for a “large” fraction of  $x$ 's?

**Observation** [60's, T'84]:  $K^t$  can be approximated within  $d \log n$  w.p  $1-1/n^d$

Proof: simply output  $n$ .

**Def:**  $K^t$  is **mildly-HOA** if there exists a polynomial  $p$ , such that no PPT heuristic  $H$  can compute  $K^t$  w.p  $1-1/p(n)$  over random strings  $x$  for inf many  $n$ .

**Def:**  $K^t$  is **mildly-HOA to c-approximate** if there exists a polynomial  $p$ , such that no PPT heuristic  $H$  can  $c$ -approximate  $K^t$  w.p  $1-1/p(n)$  over random strings  $x$  for inf many  $n$ .

# Main Theorem

The following are equivalent:

1. **OWFs** exist
2.  $\exists$  poly  $t(n) > 0$ , s.t.  **$K^t$  is mildly-HOA.**
3.  $\forall c > 0, \epsilon > 0$ , poly  $t(n) > (1 + \epsilon) n$ ,  
 **$K^t$  is mildly-HOA to  $(c \log n)$ -approx.**

# Main Theorem

The following are equivalent:

1. **OWFs** exist
2.  $\exists$  poly  $t(n) > 0$ , s.t.  $K^t$  is mildly-HOA.
3.  $\forall c > 0, \epsilon > 0$ , poly  $t(n) > (1 + \epsilon)n$ ,  
 $K^t$  is mildly-HOA to  $(\text{clog } n)$ -approx.

**Corr:** For all poly  $t(n) > (1 + \epsilon)n$ ,  
OWFs exists iff  $K^t$  is mildly hard-on-average

**Corr:** For all  $c > 0, \epsilon > 0$ , poly  $t(n) > (1 + \epsilon)n$ ,  
 $K^t$  is mildly hard-on-average to  $(\text{clog } n)$ -approx iff  $K^t$  is mildly hard-on-average.

# Earlier Connections between OWF and $K^t$

- [RR'97,KC00,ABK+06]: OWF  $\Rightarrow$  exists poly  $t$  s.t  $K^t$  is *worst-case* hard
  - converse direction not known
  - this will be our starting point to showing OWF  $\Rightarrow K^t$  is HOA
- [Santhanam'19]: Under a new conjecture, MCSP is “errorless-HOA” iff OWF exists
  - as mentioned, MCSP is closely related to  $K^t$
  - in contrast, our results are unconditional.

# Main Theorem

The following are equivalent:

1. **OWFs** exist
2.  $\exists$  poly  $t(n) > 0$ , s.t.  $K^t$  is mildly-HOA.
3.  $\forall c > 0, \epsilon > 0$ , poly  $t(n) > (1 + \epsilon)n$ ,  
 $K^t$  is mildly-HOA to  $(c \log n)$ -approx.

**Proof:** (2)  $\Rightarrow$  (1)  $\Rightarrow$  (3)

**Today:** just sketch (1)  $\Leftrightarrow$  (2)



# Theorem 1

Assume there exists some  $\text{poly } t(n) > 0$ , s.t.  $K^t$  is mildly-HOA.  
Then OWFs exist.

# Theorem 2

Assume OWFs exists.  
Then there exists some  $\text{poly } t(n) > 0$  s.t.  $K^t$  is mildly-HOA.

# Theorem 1

Assume there exists some poly  $t(n) > 0$ , s.t.  $K^t$  is mildly-HOA.  
Then OWFs exist.

**Weak OWF:** “mild-HOA version” of a OWF:  
efficient function  $f$  s.t. no PPT can invert  $f$  w.p.  $1 - 1/p(n)$   
for inf many  $n$ , for some poly  $p(n) > 0$ .

**Lemma [Yao'82].** If a Weak OWF exists, then a OWF exists.

**So, we just need to construct a weak OWF.**

Let  $c$  be a constant so that  $K^t(x) < |x| + c$  for all  $x$

Define  $f(\Pi', i)$  where  $|\Pi'| = n$ ,  $|i| = \log(n+c)$  as follows:

- Let  $\Pi$  = first  $i$  bits of  $\Pi'$  (i.e., truncate  $\Pi'$  to  $i$  bits).
- Let  $y$  = output of  $\Pi$  after  $t(n)$  steps.
- Output  $i || y$ .

Assume for contradiction that  $f$  is not a Weak OWF.

Then, for every inverse polynomial  $\delta$ , there exists a PPT **attacker A** that inverts  $f$  w.p  $1 - \delta$ .

We construct a **heuristic H** (using  $A$ ) that **computes  $K^t$  w.p.  $1 - \delta$   $O(n)$** , which concludes that  $K^t$  is not mildly HOA, a contradiction.

**Heuristic  $H(y)$**  proceeds as follows given  $x \in \{0,1\}^n$ :

- For  $i = 1$  to  $n+c$ 
  - Run  $A(i | y) \rightarrow \Pi$  and check if  $\Pi$  outputs  $y$  within  $t(n)$  steps
- Output the smallest  $i$  for which the check passed.

*Intuitively*, if  $A$  succeeds with VERY high probability, then it should also succeed with high probability conditioned on length  $i$ , for EVERY  $i \in [n+c]$

**But:** the problem is that  $H$  is feeding  $A$  the **wrong distribution** over  $y$ 's.

**In OWF experiment**

(where A works):

$i \leftarrow U_{\log(n+c)}$

$y \leftarrow$  output of a random program  
of length  $i$

**In the emulation by H in  $K^t$  experiment**

(where we need to *prove* that A works):

$i \leftarrow K^t(y)$

$y \leftarrow U_n$

**No reason to believe that the output of a random program will be close to uniform!**

**But:** using a counting argument, we can show that they are not too far in **relative distance**

### In OWF experiment

(where A works):

$i \leftarrow U_{\log(n+c)}$

$y \leftarrow$  output of a random program  
of length  $i$

### In the emulation by H in $K^t$ experiment

(where we need to *prove* that A works):

$i \leftarrow K^t(y)$

$y \leftarrow U_n$

### Key idea:

- Assume for simplicity that **A** is deterministic.
- Consider some string **y** on which **H** fails. **y** has prob mass  $2^{-n}$  in the  $K^t$  exp.
- For **H(y)** to fail, **A(w||y)** must fail where  $w = K^t(y)$ .
- But the pair  $w||y$  is sampled in the OWF exp w.p

$$1/(n+c) * 2^{-w} > 1/(n+c) * 2^{-n+c} > 1/O(n) 2^{-n}$$

- So, if H fails w.p.  $\epsilon$ , A must fail w.p  $> \epsilon / O(n) \leq \delta$
- **Thus. H fails w.p  $\epsilon \leq \delta O(n)$**

# Theorem 1

Assume there exists some  $\text{poly } t(n) > 0$ , s.t.  $K^t$  is mildly-HOA.  
Then OWFs exist.

# Theorem 2

Assume OWFs exists.  
Then there exists some  $\text{poly } t(n) > 0$  s.t.  $K^t$  is mildly-HOA.

# Theorem 1

Assume there exists some poly  $t(n) > 0$ , s.t.  $K^t$  is mildly-HOA.  
Then OWFs exist.

# Theorem 2

Assume OWFs exists.  
Then there exists some poly  $t(n) > 0$  s.t.  $K^t$  is mildly-HOA.



# Theorem 2

Assume OWFs exists.

Then there exists some poly  $t(n) > 0$  s.t.  $K^t$  is mildly-HOA.

**High-level Idea** [KC'00,ABK+'06]:

- Use OWF  $f$  to construct a **PRG**  $G: \{0,1\}^n \rightarrow \{0,1\}^{2n}$  [HILL'99]  
(output of  $G(U_n)$  is indistinguishable from  $U_{2n}$  by PPT observers)
- Use algorithm  $H$  for computing  $K^t$  to distinguish output of PRG from random, where  $t =$  running time of  $G$ , which yields a contradiction.

Uniform

$y \leftarrow U_{2n}$

$K^t(y) > 2n - O(\log n)$  w.h.p

Pseudorandom

$y \leftarrow G(U_n)$

$K^t(y) < n + O(1)$  w.p 1

So any algorithm  $H$  that computes  $K^t$  can break the PRG.

**Important:**

- Only works if  **$H$  computes  $K^t$  w.p 1.**
- if  $H$  is just a heuristic (that works w.p  $1 - \text{neg}$ ), then we have no guarantees:  $H$  can fail on all pseudorandom strings, as they have tiny probability mass!

# Entropy-preserving PRG (EP-PRG)

Efficiently computable function  $G:\{0,1\}^n \rightarrow \{0,1\}^{n+c \log n}$

- **Pseudorandomness:**  $G(U_n)$  indistinguishable from  $U_{n+c \log n}$
- **Entropy-preserving:**  $G(U_n)$  has Shannon entropy  $n - O(\log n)$

**Lemma:** EP-PRG with running time  $t$  implies  $K^t$  is mildly-HOA

**Uniform**

$y \leftarrow U_{n+O(\log n)}$

$K^t(y) > n+O(\log n)$       **w.h.p**

**Pseudorandom**

$y \leftarrow G(U_n)$

$K^t(y) < n+O(1)$       **w.p 1**

If  $G$  is an EP-PRG, then  $H(y) < n + O(1)$  w.p  $O(1)/n^2$  given pseudo random samples

**Idea:**

- If Shannon entropy is  $n - O(\log n)$ , then using an averaging argument, there exists a set  $S$  of strings in the support of  $G(U_n)$ , s.t.
  - for every  $y \in S$ ,  $\Pr[G(U_n) = y] < 2^{-(n-O(\log n))}$
  - $\Pr[S] > 1/n$
- That is, conditioned on  $S$ , the **relative distance from uniform** is small, and we can use the same argument as for Thm 1 to argue that  $H$ 's failure probability will be small.

# Constructing EP-PRG

**Good News:** GL'89 construction of a PRG from a **OWP**  $f$  is entropy preserving.

$$G(s,r) = r, \underbrace{f(s), GL(s,r)}_{\text{Entropy } n}$$

**Bad News:**

- HILL' 99 construction of a PRG from **OWF** is not entropy preserving (as far as we can tell)
- Don't know how to obtain an EP-PRG from OWF...

**Need to relax the notion of an EP-PRG.**

# Entropy-preserving PRG (EP-PRG)

Efficiently computable function  $G:\{0,1\}^n \rightarrow \{0,1\}^{n+c \log n}$

- **Pseudorandomness:**  $G(U_n)$  indistinguishable from  $U_{n+c \log n}$
- **Entropy-preserving:**  $G(U_n)$  has Shannon entropy  $n - O(\log n)$

# Conditionally Entropy-preserving PRG (condEP-PRG)

Efficiently computable function  $G:\{0,1\}^n \rightarrow \{0,1\}^{n+c \log n}$

- **Pseudorandomness:**  $G(U_n \mid \mathbf{E})$  indistinguishable from  $U_{n+c \log n}$
- **Entropy-preserving:**  $G(U_n \mid \mathbf{E})$  has Shannon entropy  $n - O(\log n)$

For some event  $\mathbf{E}$

**Lemma:** condEP-PRG with running time  $t$  implies  $K^t$  is mildly-HOA

Same proof as before works.

# Constructing condEP-PRG from OWF

**Lemma:** OWF  $\Rightarrow$  cond EP-PRG

Proof:

- Use a variant of PRG from **regular OWF** from [HILL'99,GoI'01,YLW'15]
- Show that it satisfies our notion of a cond EP-PRG when using **any OWF**.

$$\mathbf{G}(s,r_1,r_2,r_3,i) = \underbrace{r_1,r_2,r_3, [\text{Ext}_{r_1}(s)]_{i-O(\log n)} [\text{Ext}_{r_2}(f(s))]_{n-i-O(\log n)}}_{\text{Shannon Entropy } n - O(\log n)} \mathbf{GL}(s,r_3)$$

Not a PRG. Not EP.

But is a PRG and EP **conditioned** on the event that  $(i,s)$  is “good”

“good” :  $s$  has regularity  $r$  that is “common”,  $i = r$

Ensures that extractors work.



# Theorem 1

Assume there exists some poly  $t(n) > 0$ , s.t.  $K^t$  is mildly-HOA.  
Then OWFs exist.

# Theorem 2

Assume OWFs exists.  
Then there exists some poly  $t(n) > 0$  s.t.  $K^t$  is mildly-HOA.

# Main Theorem

For all  $\epsilon > 0$ , all poly  $t(n) > (1 + \epsilon)n$

**OWFs** exist iff  **$K^t$  is mildly-HOA**.

**First natural avg-case problem characterizing the feasibility of the basic tasks in Crypto**  
(i.e., private-key encryption, digital sigs, PRGs, PRFs, commitments, authentication, ZK...)

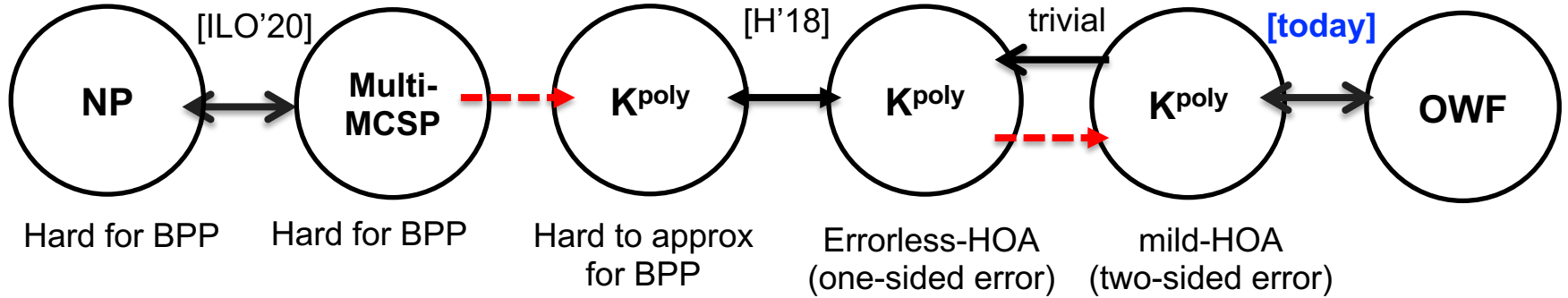
# Recent Results on $K^t$ and Friends

- [Hirahara'18]: presents a **worst-case to average-case reduction** for  $K^t$ :  
 $K^t$  is **errorless-HAO** if  $K^t$  is **worst-case** hard to approximate.  
Similar results indep. obtained by [Santhanam'19] w.r.t. a variant of MCSP.

*Our results to not extend to errorless-HAO...*

- [Ilango-Loff-Oliviera'20]: **Multi-MCSP** is NP-Hard
- [Oliviera-Santhanam]: Hardness magnification for MCSP

# Towards the “holy-grail”



Missing implications

Thank You