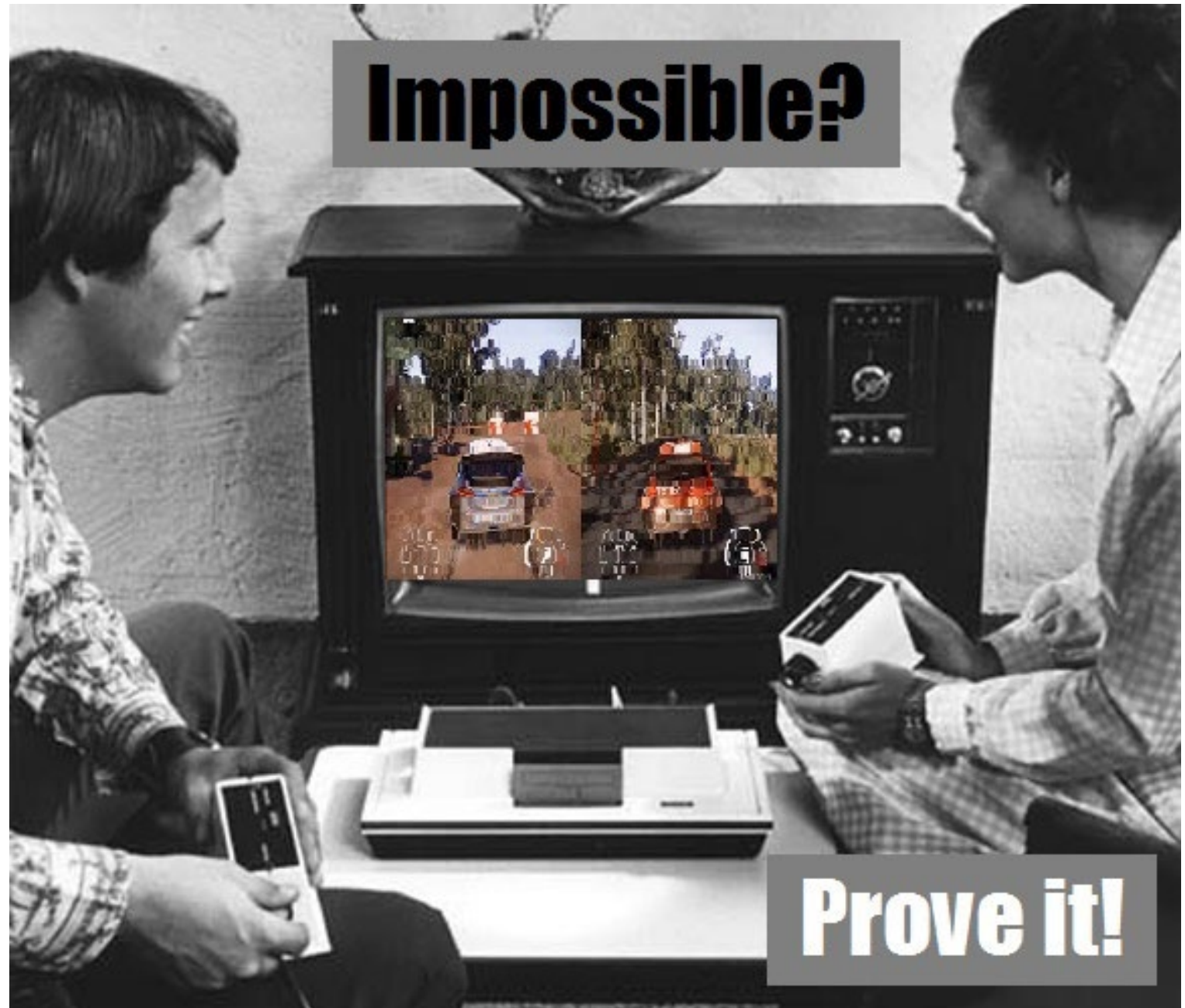


# Correlation bounds and all that

Emanuele Viola

Northeastern University

2023 02 16



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# Announcements

- **Survey:**

- Correlation bounds against polynomials (2008)**

- Revised 2022

- **Book:**

- Mathematics of the impossible:**

- Computational Complexity**

- Being serialized on my blog

One possible view

$P \stackrel{?}{=} NP$



One possible view

$P \stackrel{?}{=} NP$

Circuits



One possible view

$P \stackrel{?}{=} NP$

Circuits

Communication





One possible view

$P \stackrel{?}{=} NP$

Circuits

Communication

Rigidity



One possible view

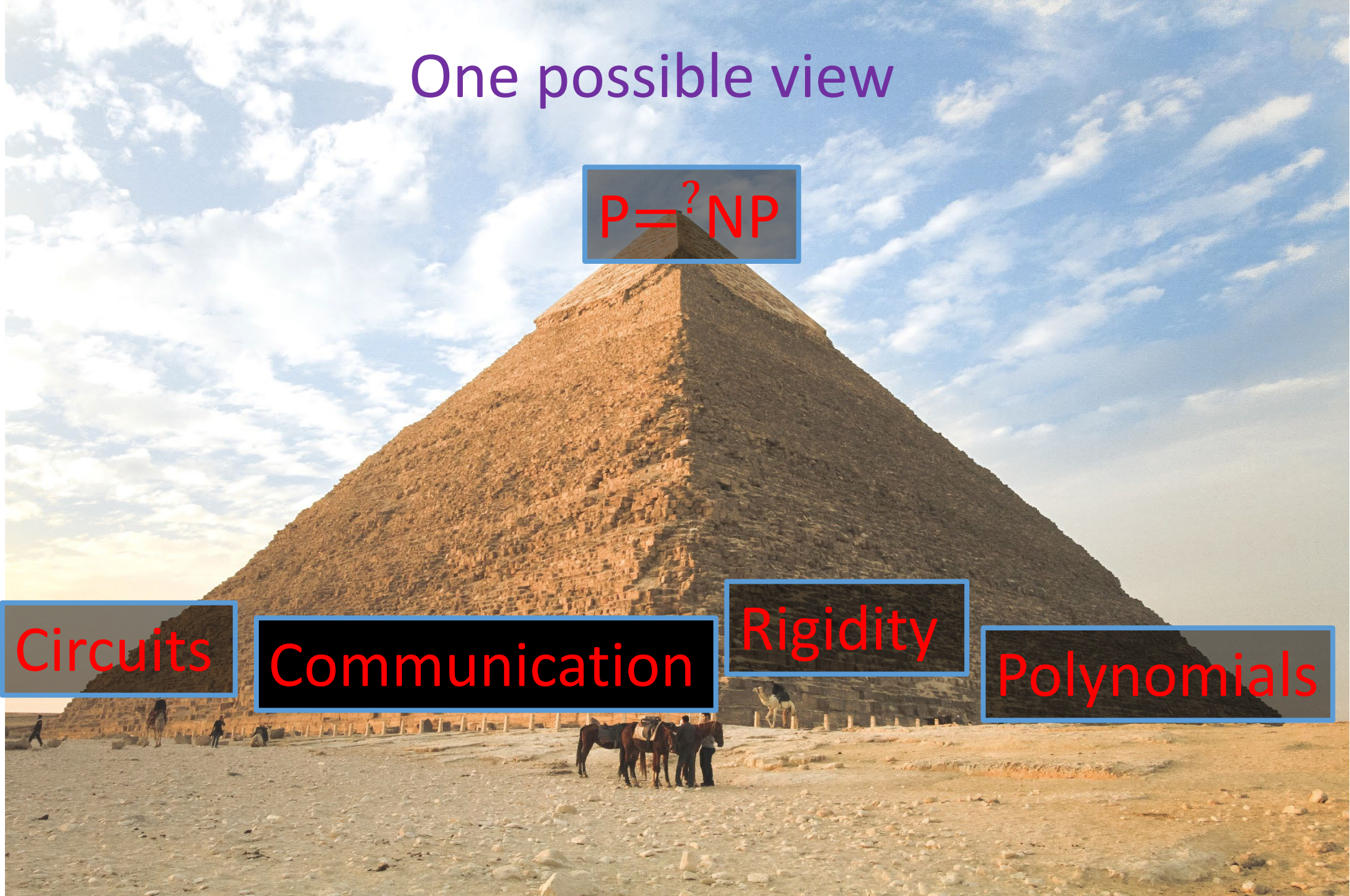
$P \stackrel{?}{=} NP$

Circuits

Communication

Rigidity

Polynomials



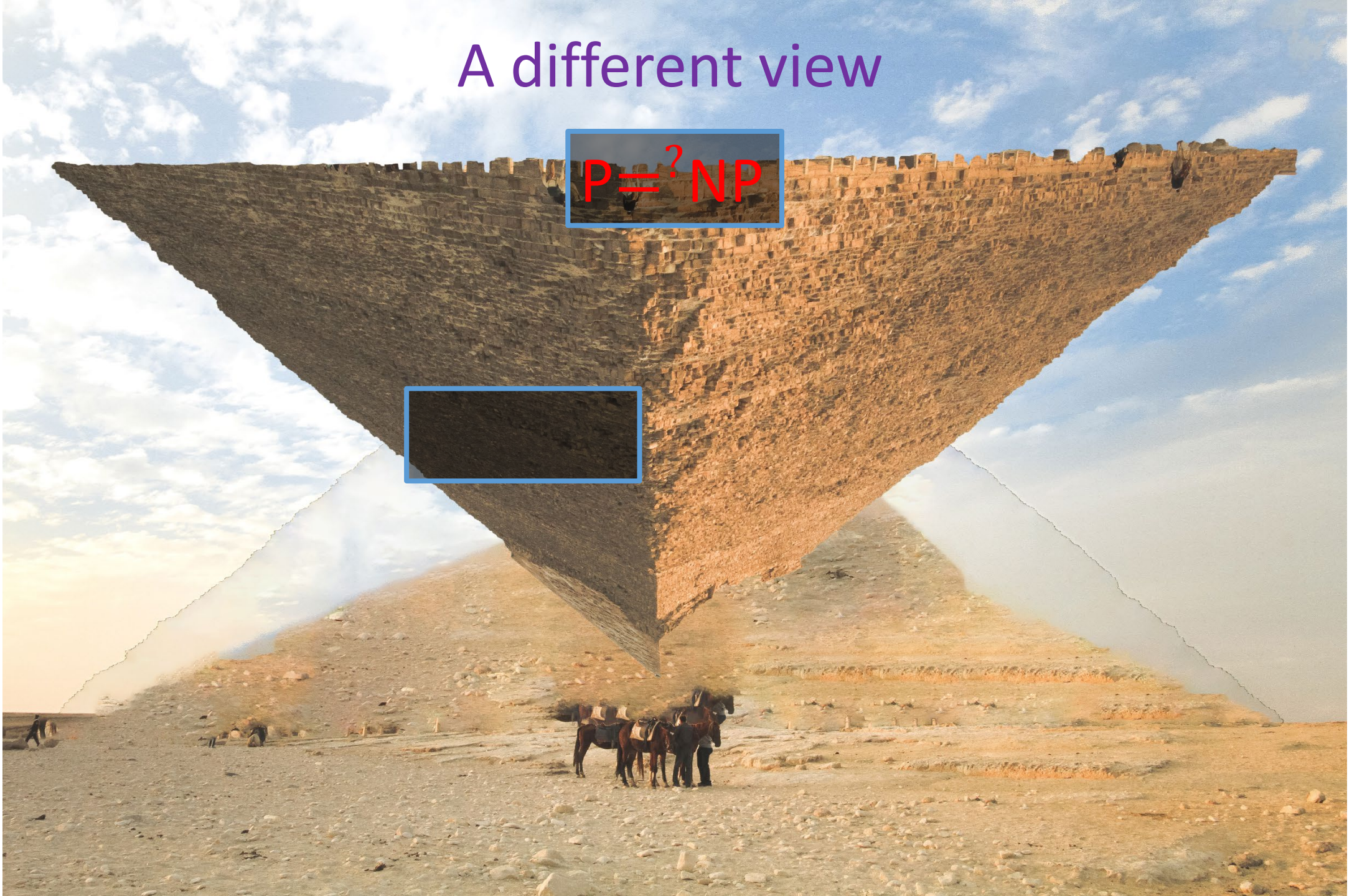
# A different view

$P \stackrel{?}{=} NP$



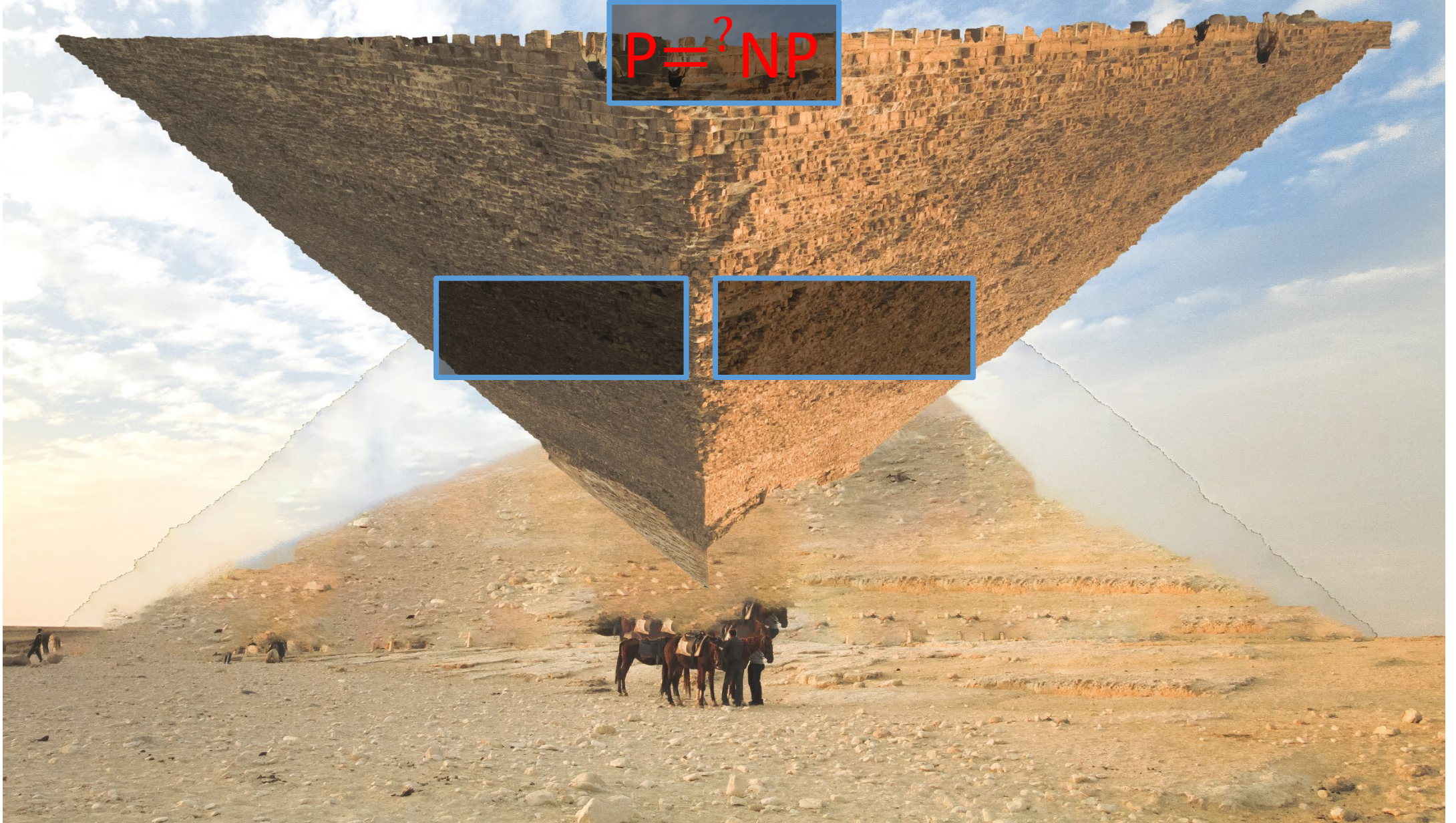
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$P \stackrel{?}{=} NP$



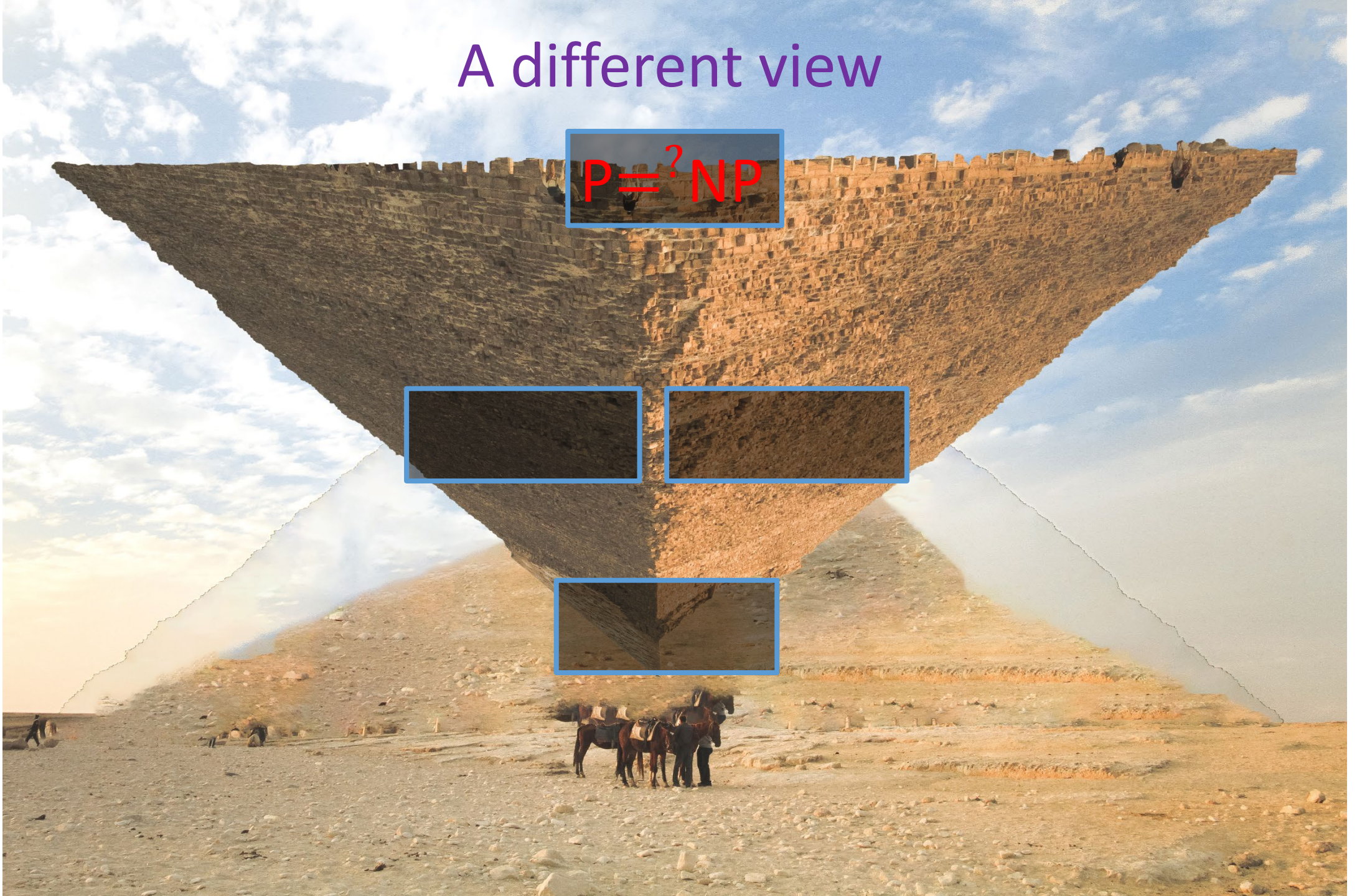
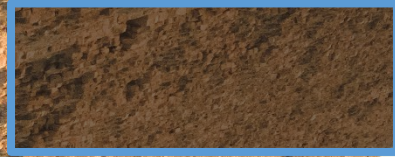
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$P \stackrel{?}{=} NP$



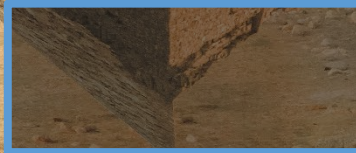
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$P \stackrel{?}{=} NP$

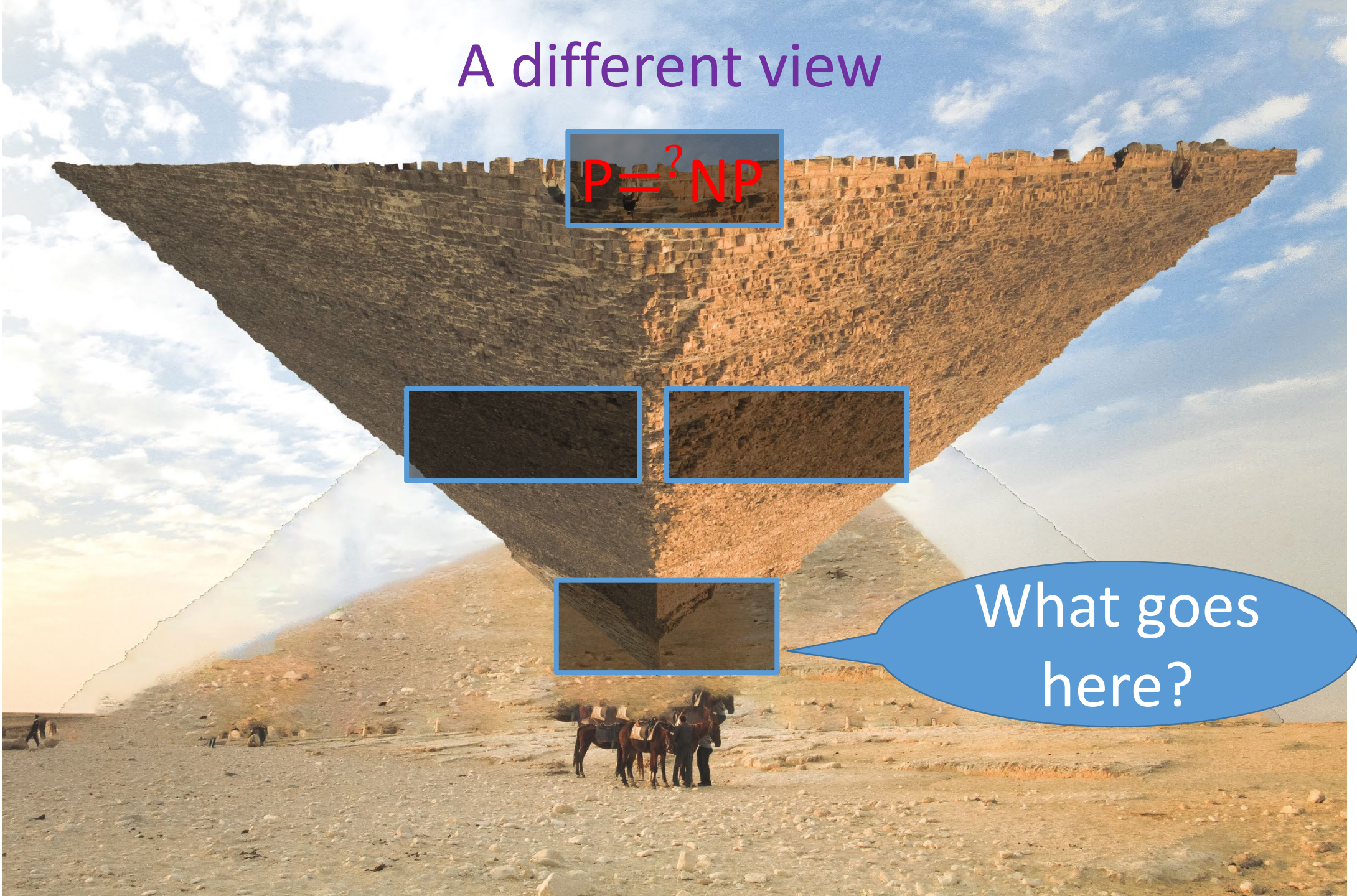


# A different view

$P \stackrel{?}{=} NP$



What goes here?



# Frontier of P vs. NP

Circuit lower  
bounds



# Frontier of P vs. NP

Circuit lower  
bounds

Matrix rigidity

# Frontier of P vs. NP

Circuit lower  
bounds

Matrix rigidity

Correlation  
bounds for  
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# Frontier of P vs. NP

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Multi-party  
Communication  
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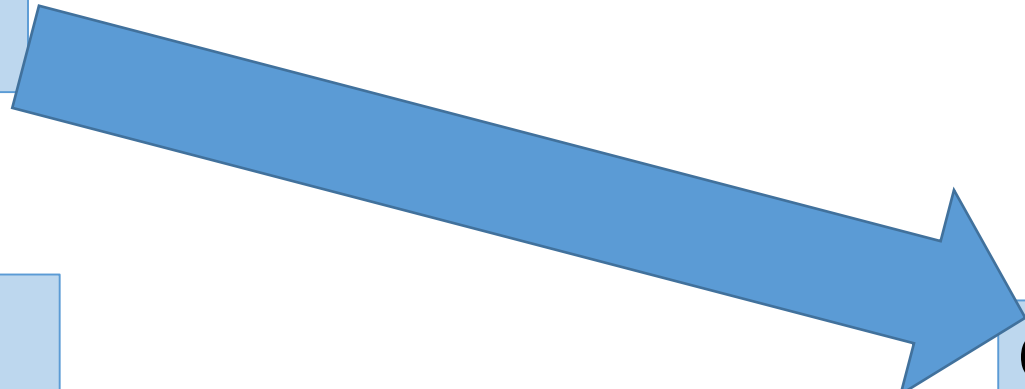
# Frontier of P vs. NP

Circuit lower bounds

Matrix rigidity

Multi-party  
Communication  
complexity

Correlation  
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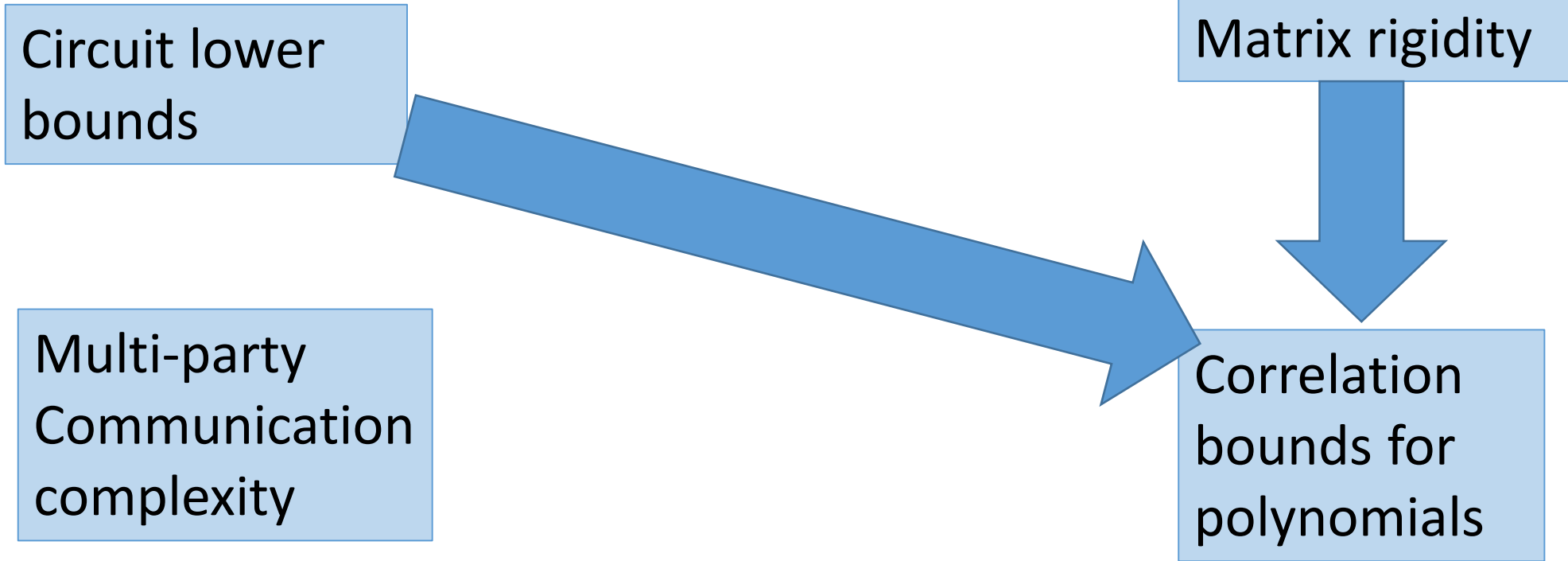
A



B

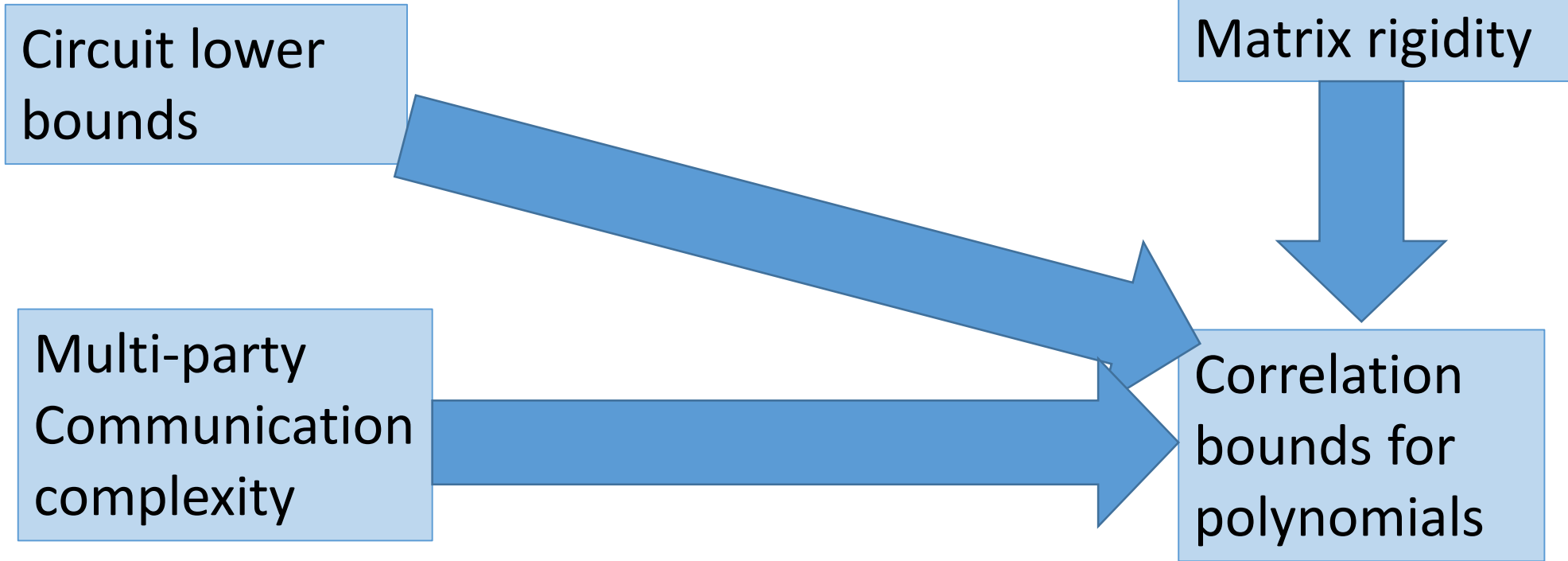
means progress on A requires progress on B

# Frontier of P vs. NP



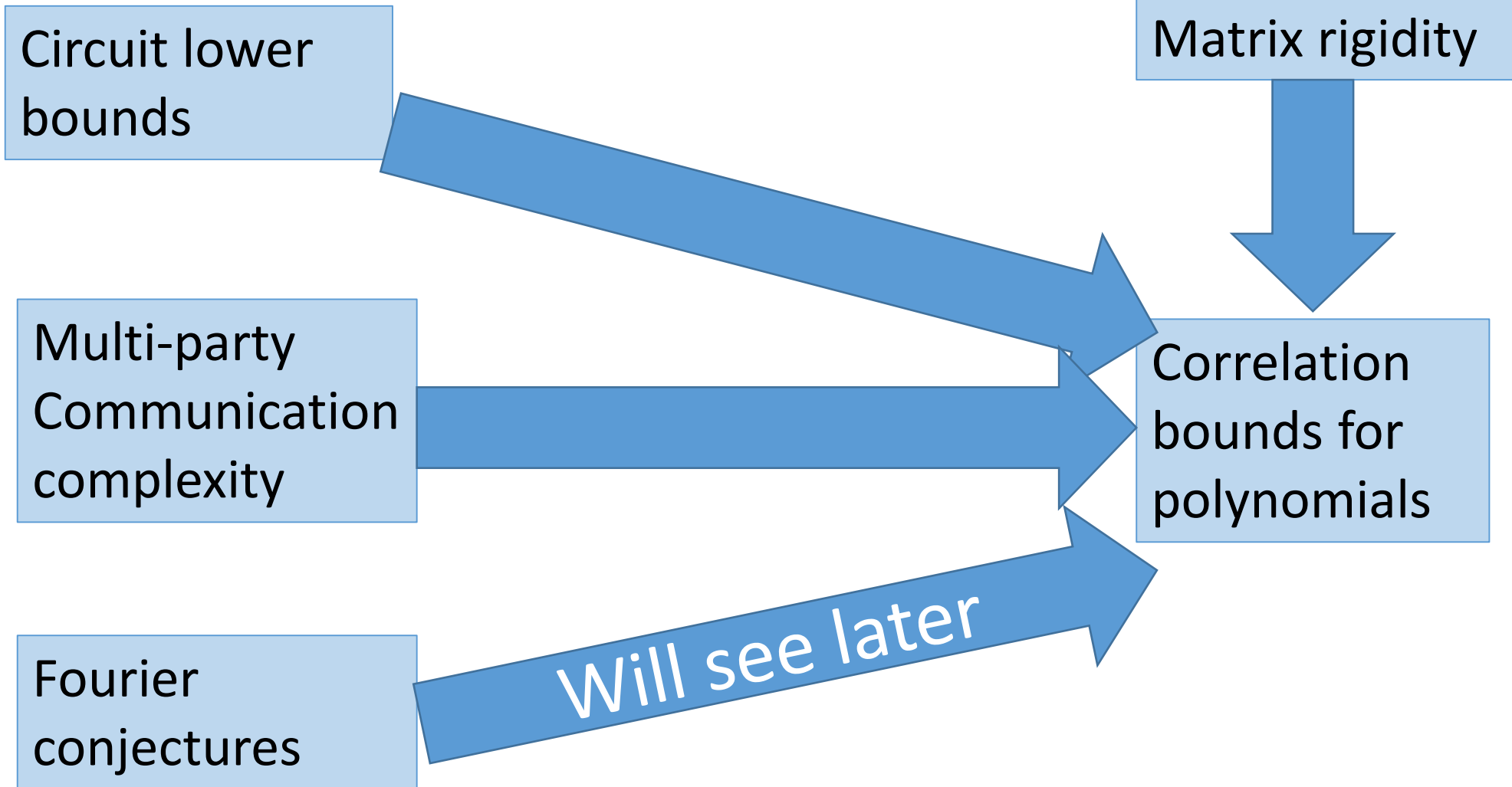
A  B means progress on A requires progress on B

# Frontier of P vs. NP



A  B means progress on A requires progress on B

# Frontier of P vs. NP



My view

$P \stackrel{?}{=} NP$

Circuits

Rigidity

Communication

Polynomials





# Correlation bounds for polynomials

- **Challenge:** Find explicit  $f: \{0,1\}^n \rightarrow \{0,1\}$  and distribution  $X$  such that for every polynomial  $p$  of degree  $d$

$$\text{Correlation}(f, p) := \Pr[f(X) = p(X)] \leq 1/2 + \epsilon$$

- Razborov, Smolenky, 80's:  $f = \text{Majority}$ ,  $X = \text{uniform}$ ,  $\epsilon = O\left(\frac{d}{\sqrt{n}}\right)$
- Babai Nisan Szegedy 90's:  $f = \text{GIP}/\text{Mod}_3$ ,  $\epsilon = 2^{-\Omega\left(\frac{n}{2^d}\right)}$
- Open:  $\epsilon = 1/\sqrt{n}$  for  $d = \log(n)$ ;  
required to solve any problem on previous slide

# Overview

- Introduction
- A couple of recent results on correlation bounds
- Pseudorandom generators, and more recent results

- **Def:** Local correlation:  $\Delta_S(F) := \mathbf{E}_{x_{-S}} \left[ \mathbf{E}_{x_S} [F(x)] - E[F] \right]^2$

- **Thm :**  $\forall$  degree  $- d$   $F \quad \exists S : |S| \leq 2^{\text{poly}(d)} : \Delta_S(F)$  small

$\Rightarrow$  new correlation bounds for small degrees

- **Conjecture :**  $|S| \leq \text{poly}(d)$  suffices

would imply dream correlation bounds for large degrees

[Ivanov Pavlovic V]

- Counterexample to CHLZ conjecture

- Rules out even weak form, shows what they prove is best possible

- Proof sketch:

Start with TRIBES DNF

For any  $S$  of size about  $n/\log n$  :  $\mathbf{E}_{x_{-S}} [\text{TRIBES} = 1] \geq \Omega(1)$

$$\Rightarrow \left[ \mathbf{E}_{x_S} [F(x)] - E[F] \right]^2 \text{ large}$$

Approximate TRIBES by  $\log(n)$ -degree polynomial  $F$

Qed

[Ivanov Pavlovic V]

- **Conjecture:** Symmetric polynomials maximize correlation with mod 3;  
would imply dream correlation bounds
- Prove the conjecture for degree 2 by “slowly opening directions”
- Prove the conjecture for special classes of degree 3

# Overview

- Introduction
- A couple of recent results on correlation bounds
- Pseudorandom generators, and more recent results

# Pseudorandom generators

- Explicit, low-entropy distributions that “look random” to polynomials
- Equivalent to correlation bounds for small error
- Case of large error remains unclear
- State-of-the-art [Bogdanov V 2007, Lovett, V]:  
To fool degree- $d$  polynomials sum  $d$  independent generators for degree 1
- Can analyze up to  $d < 0.01 \log n$ . Beyond that is unknown (more later)

# Fourier conjectures

- **Polarizing random walks:** Pseudorandom generators from Fourier bounds  
[2018 Chattopadhyay Hatami Hosseini Lovett, ...]

- To improve generators for polynomials need Fourier conjectures:

$$\sum_{S:|S|=2} |\hat{p}_S| \leq O(d^2) \quad [\text{Chattopadhyay Hatami Lovett Tal}]$$

$$\sum_{S:|S|=k} |\hat{p}_S| \leq 2^{o(dk)} \quad [\text{Chattopadhyay Gaitonde Lee Lovett Shetty}]$$

- **Theorem[V]:** (Even weaker) conjectures  
⇒ correlation bounds beating Razborov-Smolensky,  
for functions related to majority (e.g.,  $\sum_{i<j} x_i x_j > 0$ )



# New correlation bounds

- We prove new correlation bounds which aim to, but don't, resolve conjectures
- Note: Correlation with Majority still open!
- **Claim:** Smolensky  $O\left(\frac{d}{\sqrt{n}}\right)$  bound for Majority tight under **uniform** distribution
- **Claim:** Can do  $\Omega\left(\frac{d^2}{n}\right)$  for Majority under **every** distribution
- **Conjecture:** This is tight
- **Claim:** Conjecture holds (thus improving Smolensky) for  $d = 1$

Next:

New pseudorandom generators using invariant theory

# Pseudorandom generators against polynomials

- **Definition:**

$R : \{0,1\}^s \rightarrow F^n$  fools degree- $d$  polynomials in  $n$  variables over finite field  $F$  if

$$\text{Statistical-Distance}( p(R(U)), p(U) ) \leq \epsilon$$

for any such polynomial  $p$ ;  $U =$  uniform distribution

# Two lines of works

- **Small fields, e.g.,  $\{0,1\}$**

[Naor Naor '92] Degree 1

[Bogdanov-Viola '07] Paradigm: To fool degree  $d$ , sum  $d$  generators for degree 1

Analysis [BV, Lovett, V '08]: seed length  $O(\log n + 2^d)$

**Open problem:** Does paradigm work for  $d > \log n$ ?

- **Large fields,  $|F| \gg d$**

[Bogdanov '05] Reduces to hitting-set problem

Optimal hitting sets [Klivans Spielman, B, Lu, Cohen Ta-Shma, Guruswami Xing]

$\Rightarrow$  seed length  $O(d^4 \log n + \log |F|)$ , if  $|F| > d^6$  **Cannot get seed length  $< d^2$**

- Two lines followed different paradigms

## [Derksen V]

- Analyze Bogdanov-Viola paradigm for large degrees over large fields  
⇒ new generators over large fields
- **Theorem:** Explicit generators against degree- $d$  polynomials with seed length
  - (1) Optimal  $O(d \log n + \log |F|)$ , if  $|F| \geq d^4 n^{0.01}$
  - (2) Nearly optimal  $\tilde{O}(d \log n + \log |F|)$ , if  $|F| \geq d^4 \log^4 n$
  - (3) Matching previous best, if  $|F| \geq d^4$  (previous work:  $d^6$ )  
Smallest possible  $|F|$  using Weil's bound

# Proof overview

- **Definition:** Polynomial  $g(x_1, x_2, \dots, x_n)$  over  $F$  is **decomposable** if  $g = c(h(x_1, x_2, \dots, x_n))$  for some univariate  $c$  of degree  $\geq 2$
- **Lemma:**  $g$  **indecomposable**  $\Rightarrow g(U)$  close to uniform
- **Main Lemma:** Construction of polynomials  $f_1, f_2, \dots, f_n$  :
  - Few variables, low degree, and
  - **preserve indecomposability:**  $h(f_1, f_2, \dots, f_n)$  **decomposable**  $\Rightarrow h$  **decomposable**
- **Generator**  $R(U) := (f_1, f_2, \dots, f_n)(U)$ .  
**Proof:** Given  $g$ , write  $g = c(h)$  for max degree  $c$ . Note  $h$  **indecomposable**  
 $\Rightarrow g(U) = c(h(U)) \approx c(U) \approx c(h(f_1, f_2, \dots, f_n))(U) = g(f_1, f_2, \dots, f_n)(U)$

# Definition of the $f_i$

- Let  $M_1, M_2, \dots$  be all monomials in  $m$  variables (of some degree  $k$ )
- To fool degree  $d$ , take  $d$  copies  $x^{[1]}, x^{[2]}, \dots, x^{[d]}$  of the variables
- **Define**  $f_i := \sum_{j=1}^d M_i^{[j]}$  where  $M_i^{[j]}$  is  $M_i$  on variables  $x^{[j]}$
- “Algebraic” Bogdanov-Viola  
can take any polynomials  $M_i$  that fool degree-1 polynomials

# Analysis of the $f_i$

- **Assume:**  $G := g(f_1, f_2, \dots, f_n)$  decomposable as  $c(H(x_1, x_2, \dots, x_n))$ .  
**Goal:** Show  $g(x_1, x_2, \dots, x_n)$  decomposable as  $c(h(x_1, x_2, \dots, x_n))$
- $G$  **invariant** under permuting the copies of the variables (the  $f_i$  are)  
 $\Rightarrow H$  is **invariant**
- The  $f_i$  are basis for **invariant** polynomials  
 $\Rightarrow H(x_1, x_2, \dots, x_n) = h(f_1, f_2, \dots, f_s)$  for some  $h$  (possibly  $s \gg n$ )  
 $\Rightarrow g(f_1, f_2, \dots, f_n) = c(h(f_1, f_2, \dots, f_s))$ .
- $\Rightarrow g(x_1, x_2, \dots, x_n) = c(h(x_1, x_2, \dots, x_s))$  and  $s = n$ . QED



# Analysis of the $f_i$

- We give 3 versions of analysis; different tradeoffs of simplicity and generality
- Can preserve indecomposability over any field, even  $\{0,1\}$
- For generator, restriction on field size comes only from Weil's bound, used in  
**Lemma:**  $g$  indecomposable  $\Rightarrow g(U)$  close to uniform

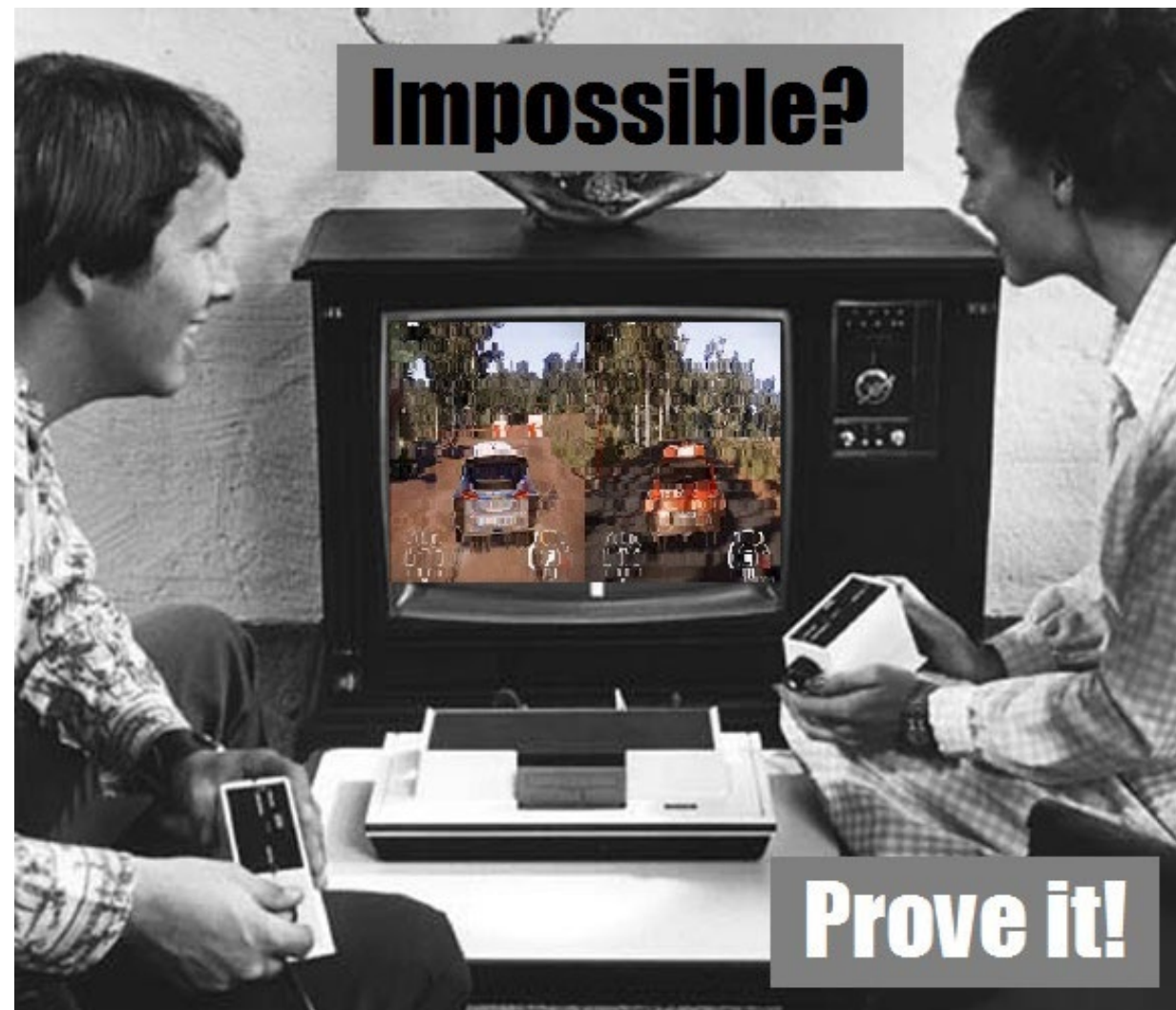
# A sense of the parameters

- **Goal:** fool  $g(x_1, x_2, \dots, x_n)$  of degree  $d$  in  $n$  variables
- Pick  $n$  distinct monomials of degree  $k$  in  $m$  variables, need  $\binom{m+k}{k} \geq n$
- Previous slides  $\Rightarrow$  suffices to fool  $g(f_1, f_2, \dots, f_n)$ , degree  $dk$  in just  $dm$  variables
- E.g., set  $m = O(\log n)$ ,  $k = O(\log n)$ .
- Setting uniform values for variables  $\Rightarrow$  seed length  $O(dm) = O(d \log n \log |F|)$
- Improve to  $O(d \log n + \log |F|)$ : combine with variant of [Bogdanov '05]
  - Non-standard: degree  $\gg$  # variables; also better dependence on  $|F|$

# Future directions

- **Goal:** optimal seed length for field size  $|F| = O(d^4)$
- May be possible with this approach given suitable extension of Weil's bound (work in progress)

# Thanks!



**Impossible?**

**Prove it!**