

# Rational Proofs

**Pablo Azar**

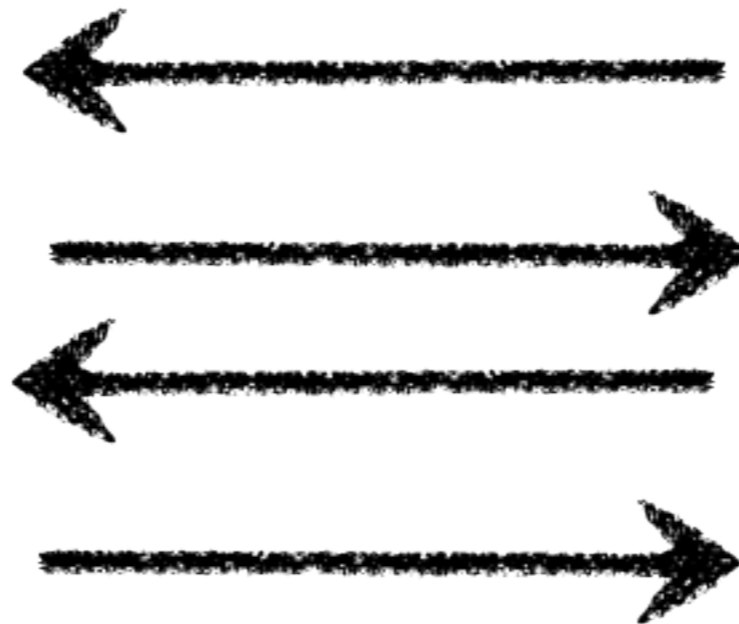
**Silvio Micali**

# Central Question

$f(x)$ ?



Arthur

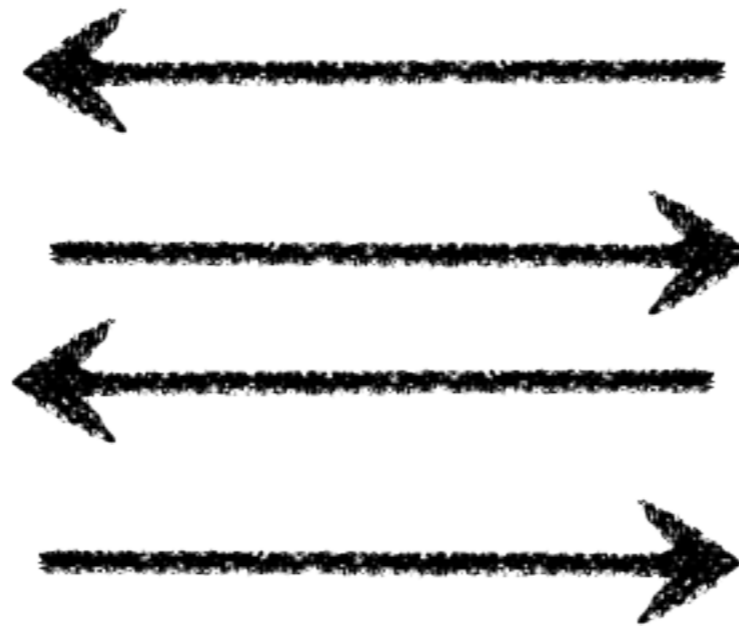


Merlin

What problems have **efficient** proofs?  
(Rounds, Communication, Time)

# Interactive Proofs

$f(x)?$



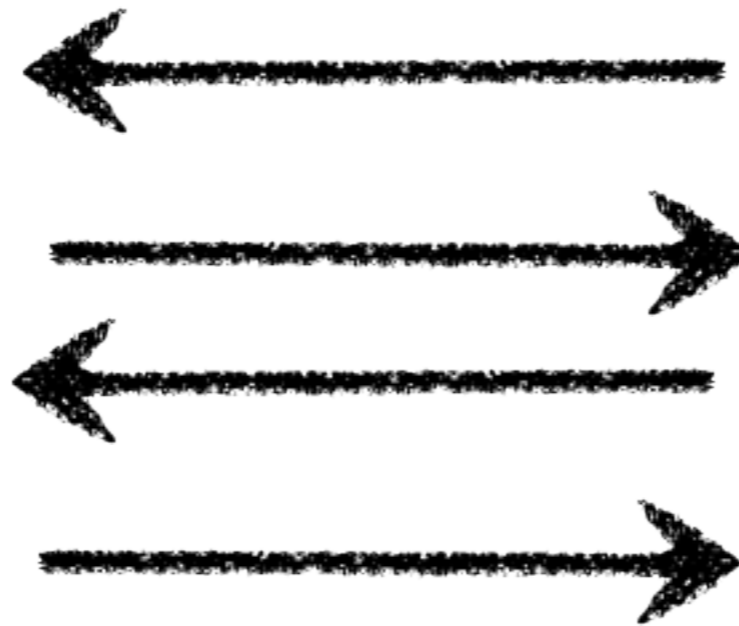
IP

AM

[ GMR 85, BM 85 ]

# Interactive Proofs

$f(x)?$



IP = PSPACE  
[ LFKN 90, Shamir 90]

And they lived happily ever after...

# Many Centuries Later...



$f(x)$ ?



# Centuries Later...

$f(x)$ ?



# Centuries Later...

$f(x)?$



$\$ \# * \# !$



# Centuries Later...

$f(x)?$



**\$#\*#!**





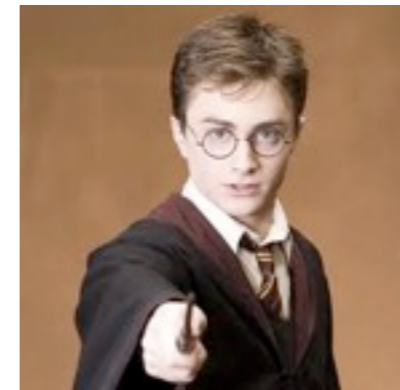
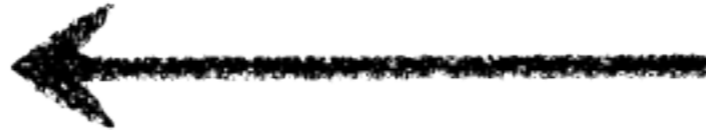
# Centuries Later...



$f(x)?$



**\$#\*#!**



# How to pay a Math Expert?

$f(x)$ ?



# How to pay a Math Expert?

$f(x)$ ?



**Fixed Price:**

Correct Proof : \$1  
Incorrect Proof: \$0

# How to pay a Math Expert?

$f(x)$ ?



**Fixed Price:**

Correct Proof : \$1  
Incorrect Proof: \$0

# Can we do better?

$f(x)$ ?



# Can we do better?

$f(x)$ ?



Can we prove **more** theorems?

Can we prove them **faster**?

# Can we do better?

$f(x)$ ?



**Fewer Rounds?**

# Our Central Question

$f(x)$ ?



What's the largest class of problems for  
which we can guarantee correctness of solution  
using monetary incentives?



# Rational MA



# $f \in \text{Rational MA}[k]$ iff



# $f \in \text{Rational MA}[k]$ iff

$\pi$  output function (poly time)

R reward function (randomized poly time)



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$\Pi$  output function (poly time)

$R$  reward function (randomized poly time)

$f(x)$ ?

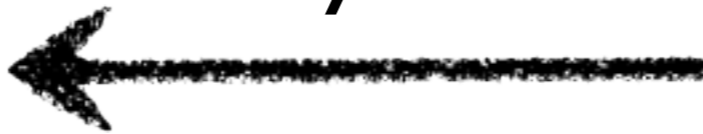


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$f(x)?$   
 $y_1$

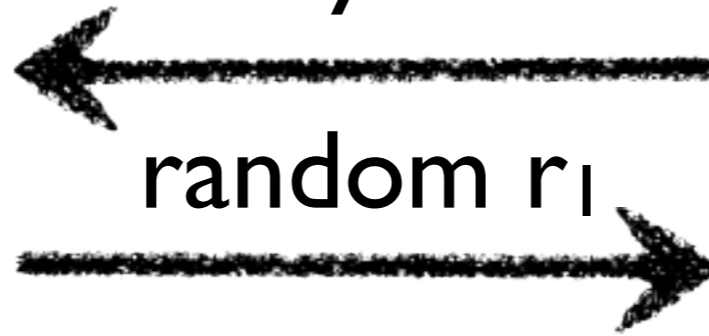


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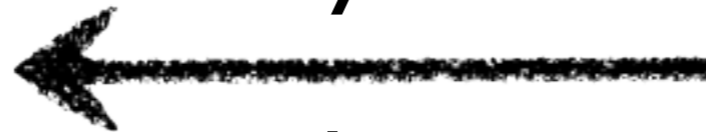
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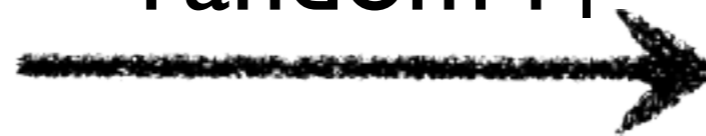
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$f(x)?$

$y_1$



random  $r_1$



$y_2$



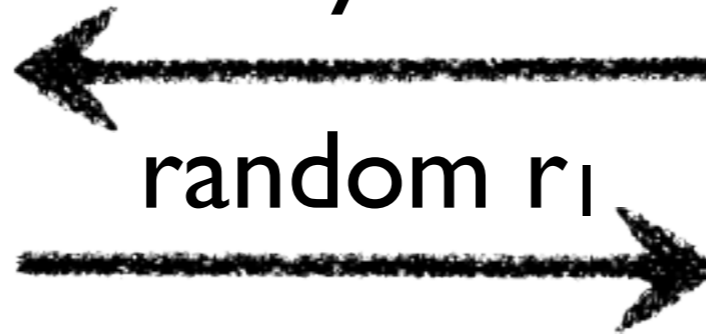
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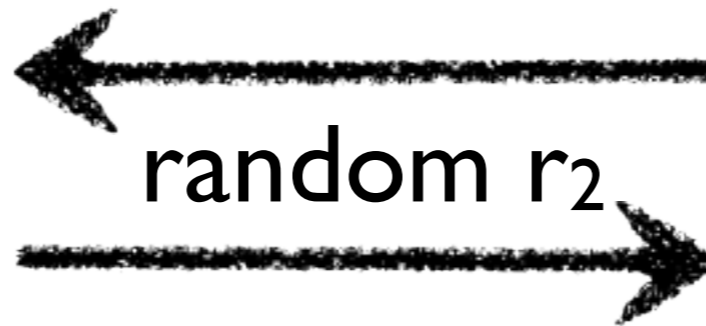
R reward function (randomized poly time)

$f(x)?$

$y_1$



$y_2$





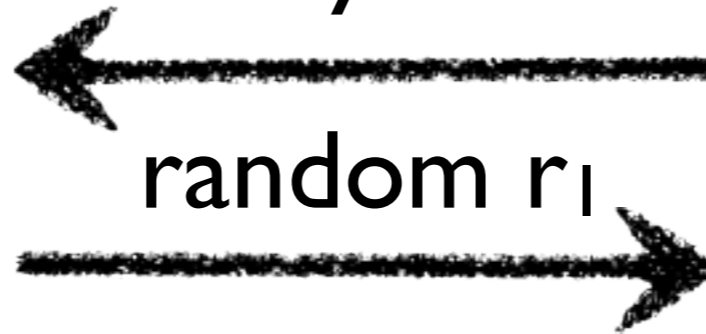
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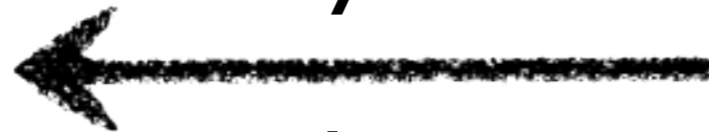
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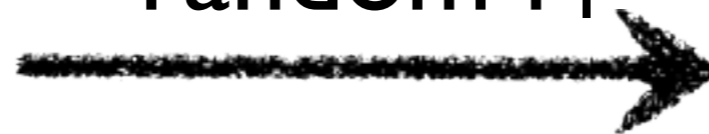
$R$  reward function (randomized poly time)

$f(x)?$

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random  $r_1$



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random  $r_2$



...



Transcript  $T = (y_1, r_1, \dots, y_k)$

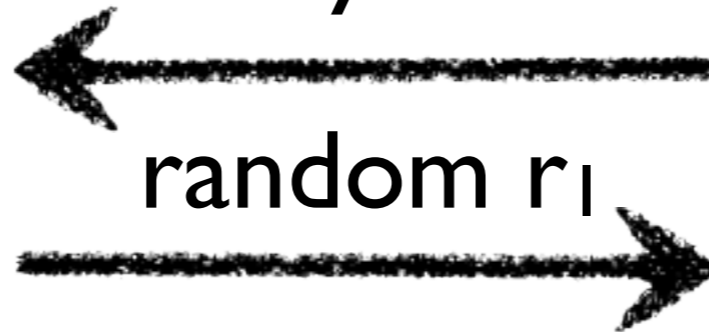
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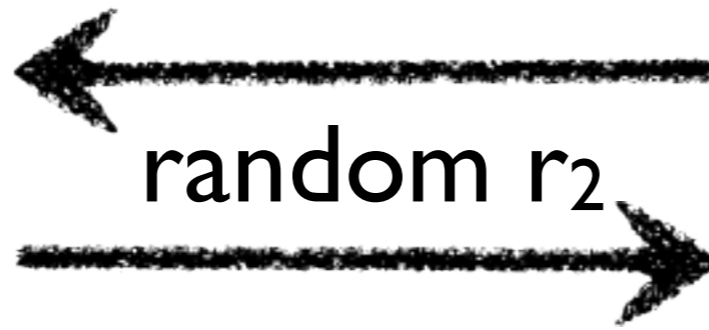
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...

$R(x, T) =$



Transcript  $T = (y_1, r_1, \dots, y_k)$



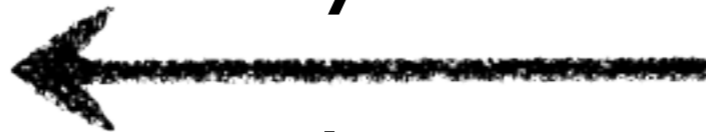
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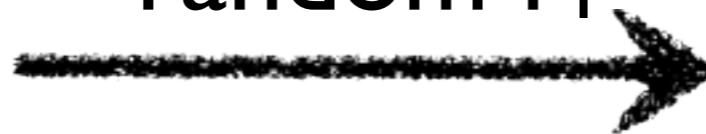
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$f(x)?$

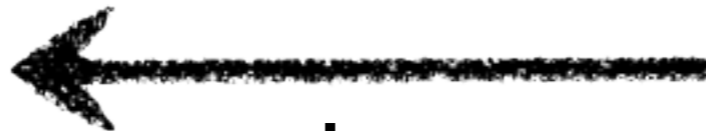
$y_1$



random  $r_1$



$y_2$



random  $r_2$



...



Output =  $\pi(x, T)$



$R(x, T) =$



Transcript  $T = (y_1, r_1, \dots, y_k)$

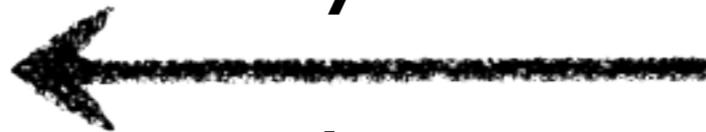
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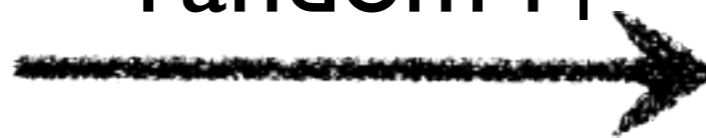
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$f(x)?$

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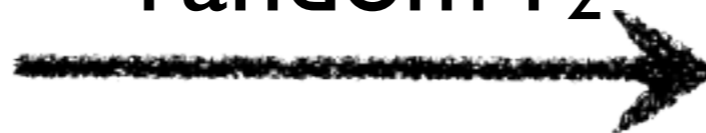
random  $r_1$



$y_2$



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...



Output =  $\pi(x, T)$



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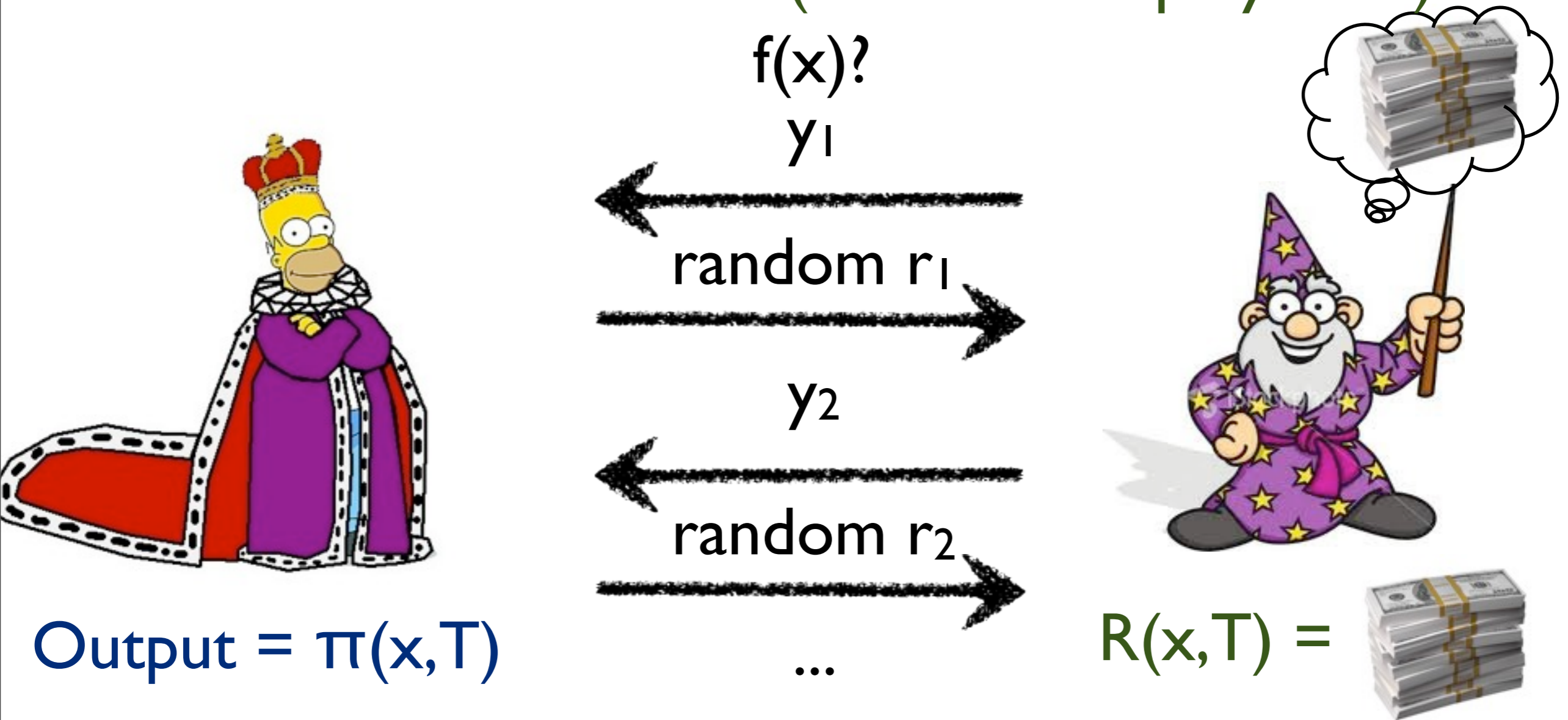
Transcript  $T = (y_1, r_1, \dots, y_k)$

**No Verification!**

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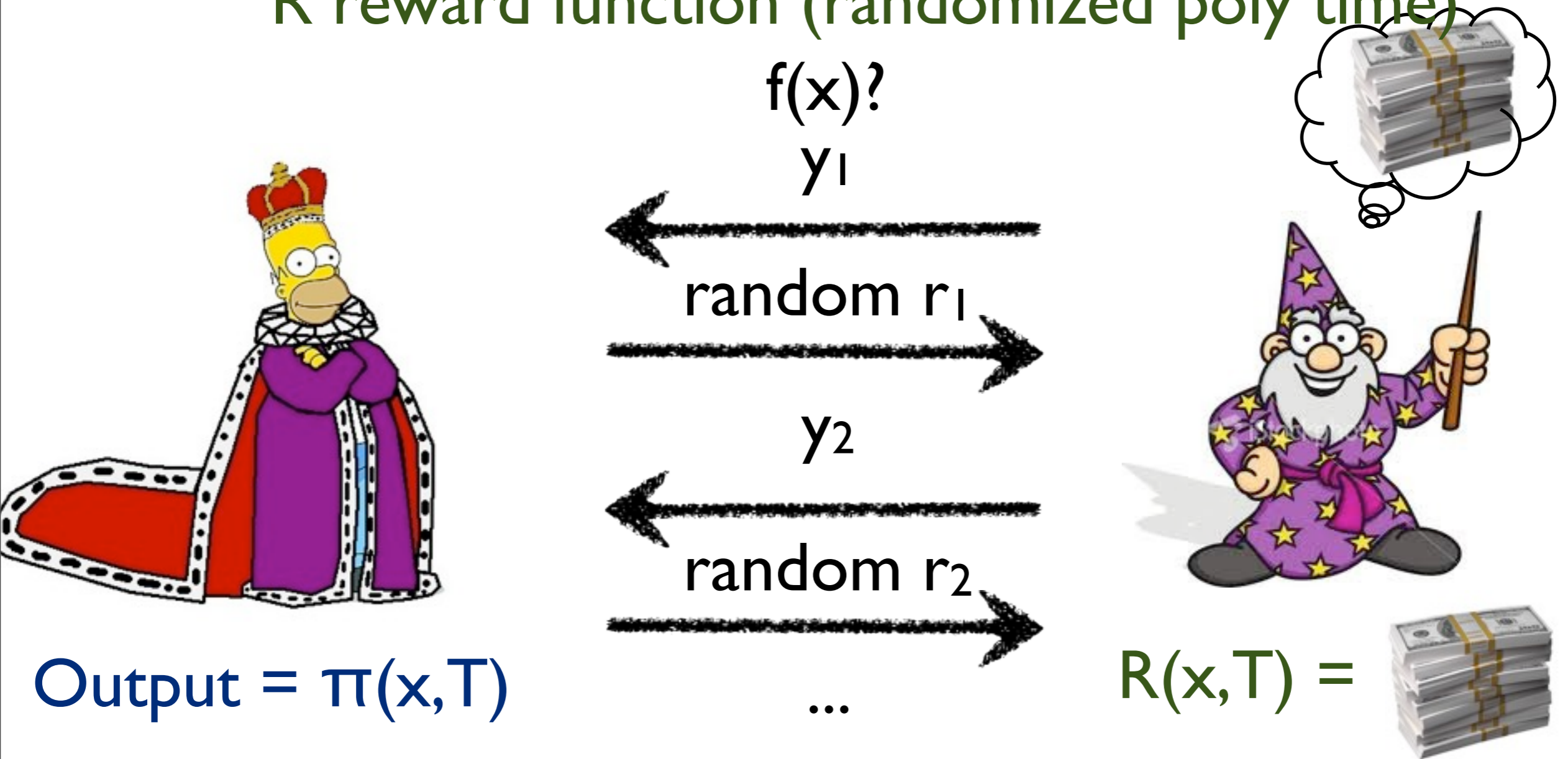
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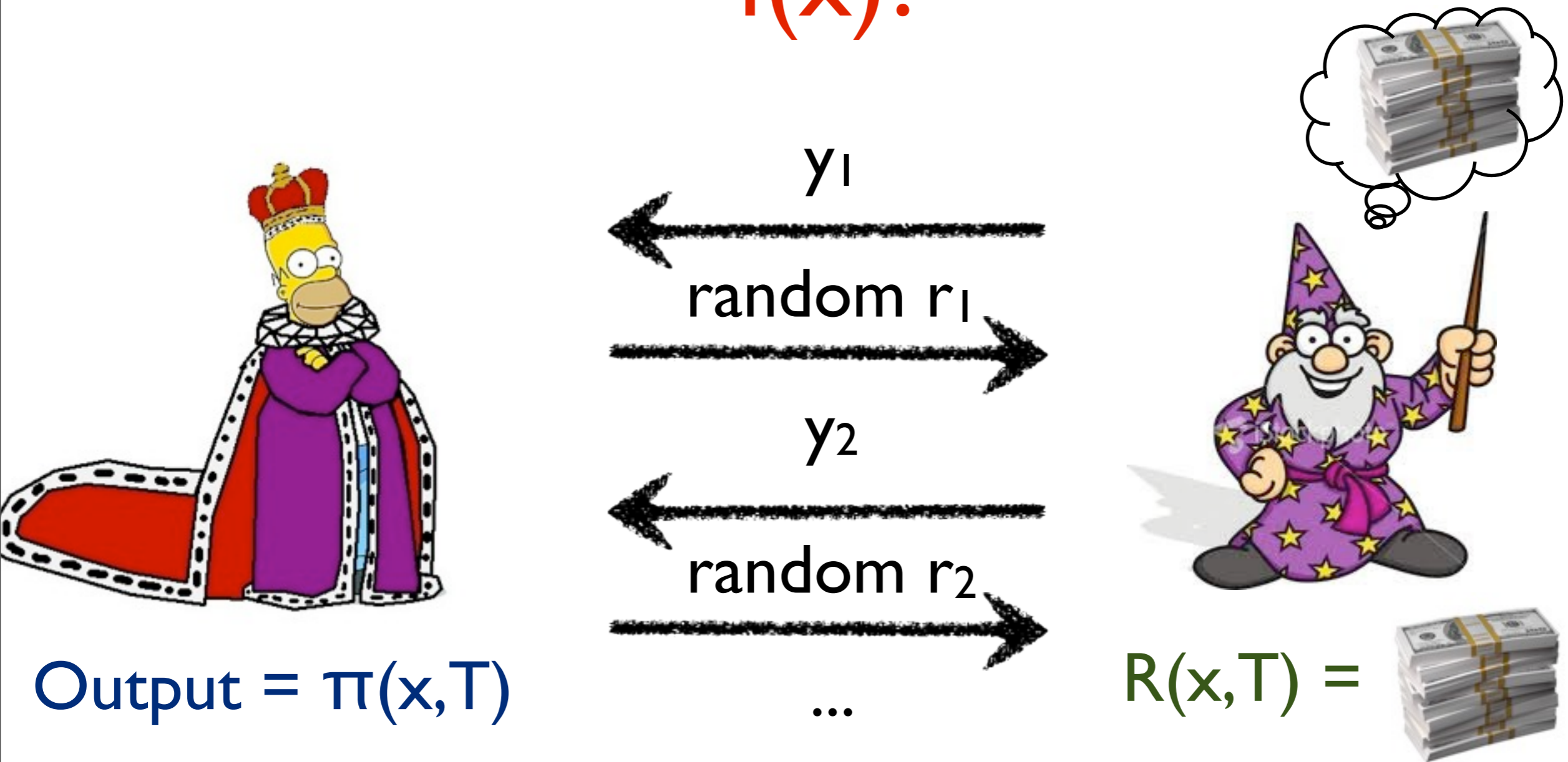
Output =  $\pi(x, T)$

$R(x, T) =$  


Merlin chooses Transcript  $T^*$  that maximizes  $E[R(x, T)]$

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$f(x)?$



Output =  $\pi(x, T)$

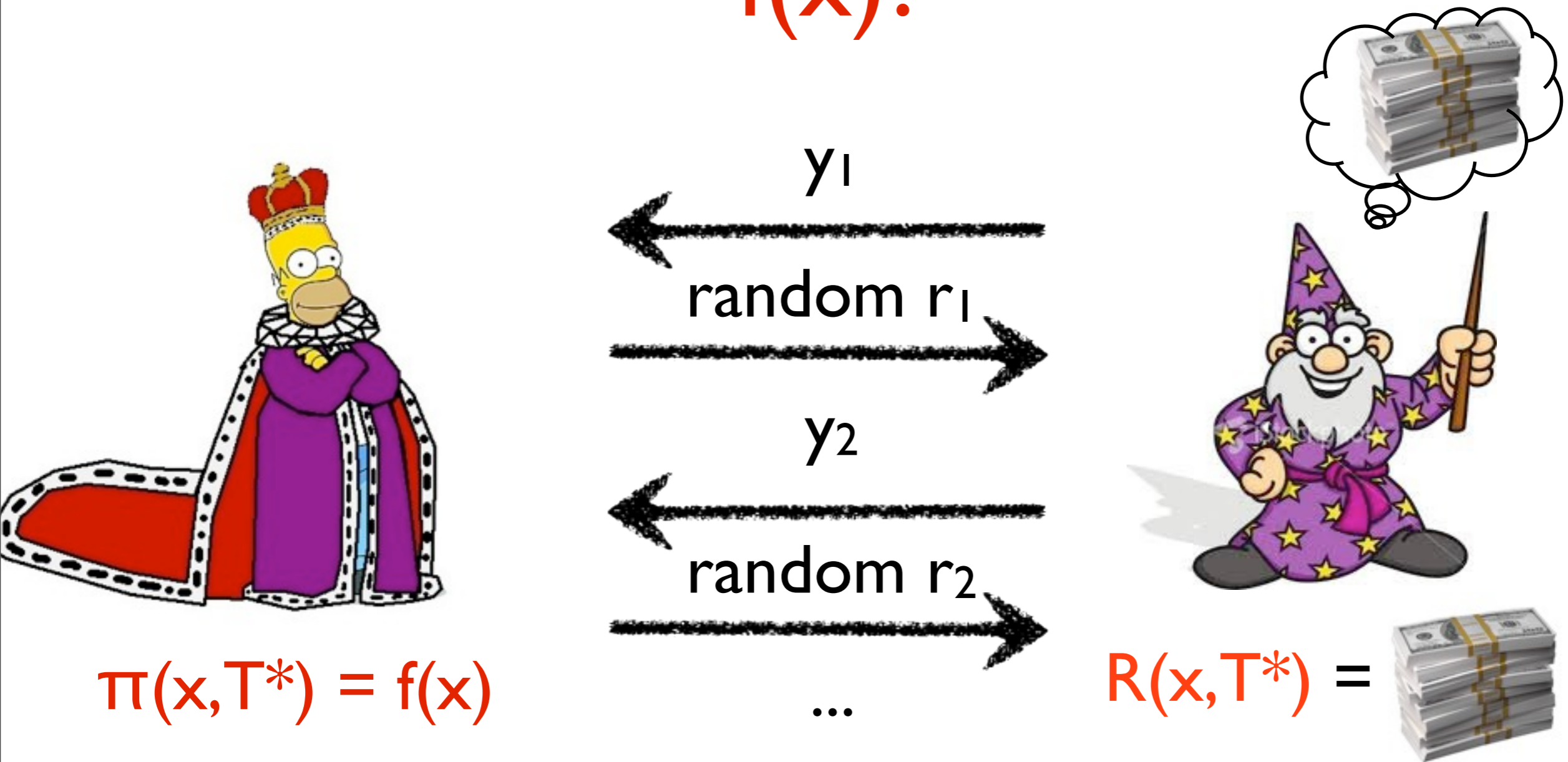
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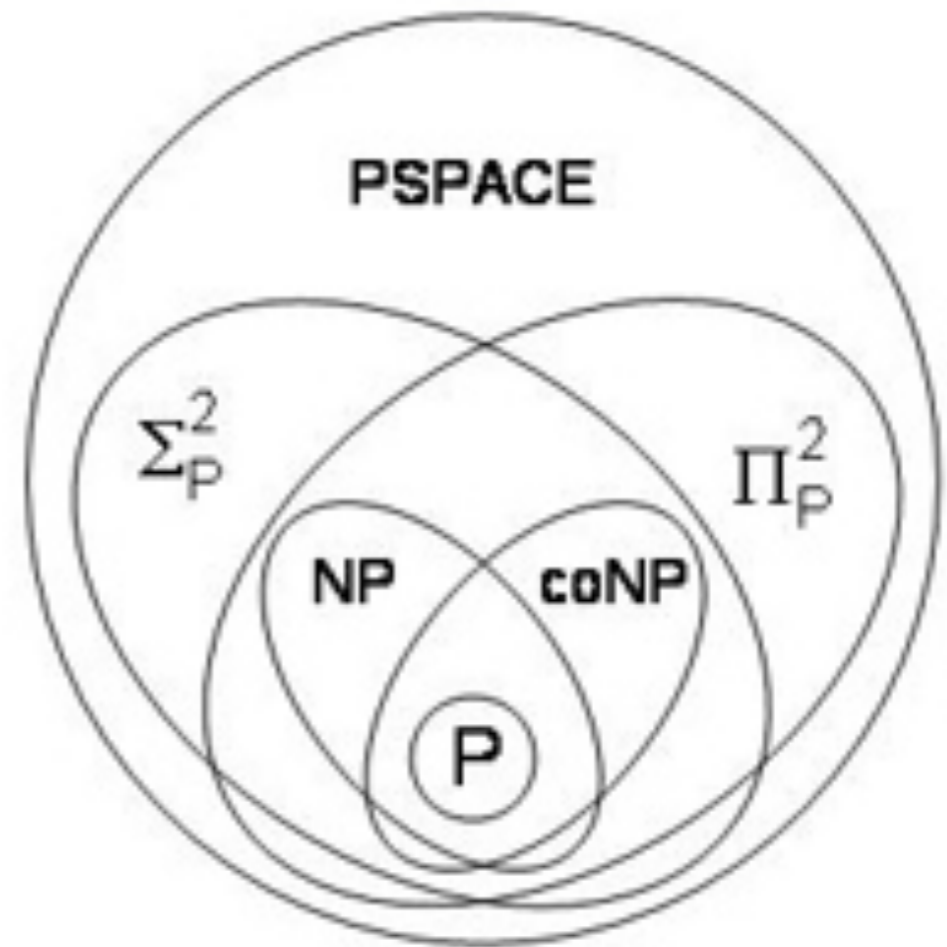
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Merlin chooses Transcript  $T^*$  that maximizes  $E[R(x, T)]$

# Our Central Question

Where does  $\text{RMA}[k]$  fit?



# Theorem 1

$$\#P \subset RMA[?]$$

# Theorem 1

$$\#P \subset RMA[1]$$

# Proof Sketch

$$\#P \subset RMA[1]$$

# #P Problems

Input:  $M : \{0, 1\}^n \times \{0, 1\}^{poly(n)} \rightarrow \{0, 1\}$   
 $x \in \{0, 1\}^n$



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Input:  $M : \{0, 1\}^n \times \{0, 1\}^{poly(n)} \rightarrow \{0, 1\}$

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$\#\{y : M(x, y) = 1\} ?$



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$$2^{301} + 13$$



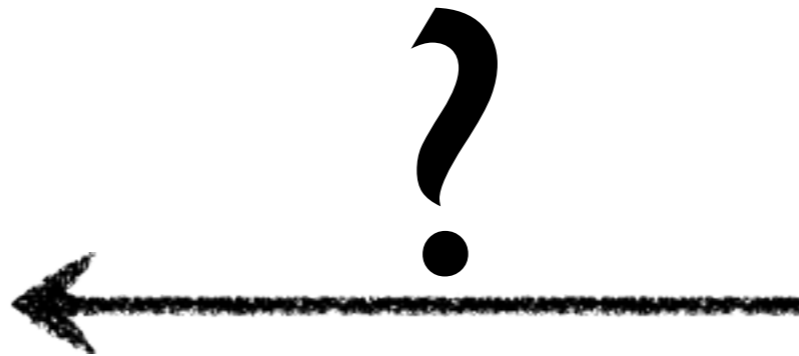


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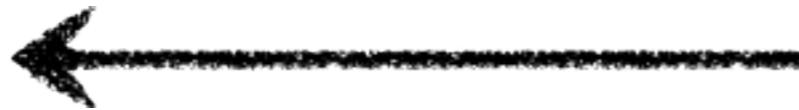
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$2^{301} + 13$



$M(x, y_1), M(x, y_2), \dots$



# #P Problems

Input:  $M : \{0, 1\}^n \times \{0, 1\}^{poly(n)} \rightarrow \{0, 1\}$   
 $x \in \{0, 1\}^n$

$\#\{y : M(x, y) = 1\} ?$

$2^{301} + 13$



$M(x, y_1), M(x, y_2), \dots$



No 1-round proof so far

# Economics To The Rescue!

# Asymmetric Information



Arthur



Merlin

# Asymmetric Information



Arthur

Information



Merlin

# Asymmetric Information



Arthur

Information



Merlin

What is information?



# Asymmetric Information



Arthur

Information



Merlin

What is information?

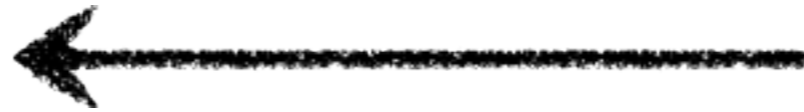
How do we guarantee it is correct?

# Computation View

$x, f$



Verifier



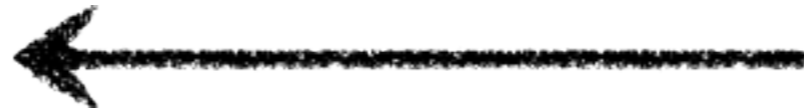
Prover

# Computation View

$x, f$



Verifier



Prover

Information is **output** of a **hard to compute function**

# Computation View

$x, f$



Verifier



Prover

Information is **output** of a **hard to compute function**

Correctness guaranteed by **proof**

# Economics View



Decision Maker



Agent

# Economics View



Decision Maker

$\mathcal{D}$



Agent

Information: **distribution**  $\mathcal{D}$  over  $\Omega$  = states of the world

# Economics View



Decision Maker

$D$



Agent

Information: **distribution**  $D$  over  $\Omega$  = states of the world

Correctness from **incentives**

# Proper Scoring Rules

[Good 52, Brier 50]





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[Good 52, Brier 50]

$$\Omega = \left\{ \begin{array}{c} \text{BOSTON} \\ \text{RED SOX} \end{array} , \text{NY} \right\}$$
$$\mathcal{D} \in \Delta(\Omega)$$



# Proper Scoring Rules

[Good 52, Brier 50]

$$\Omega = \left\{ \begin{array}{c} \text{BOSTON} \\ \text{RED SOX} \end{array} , \text{NY} \right\}$$
$$D \in \Delta(\Omega)$$

$$D(\text{Boston}) = 60\%$$
$$D(\text{NewYork}) = 40\%$$



# Proper Scoring Rules

[Good 52, Brier 50]

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$$\omega \leftarrow \mathcal{D}$$

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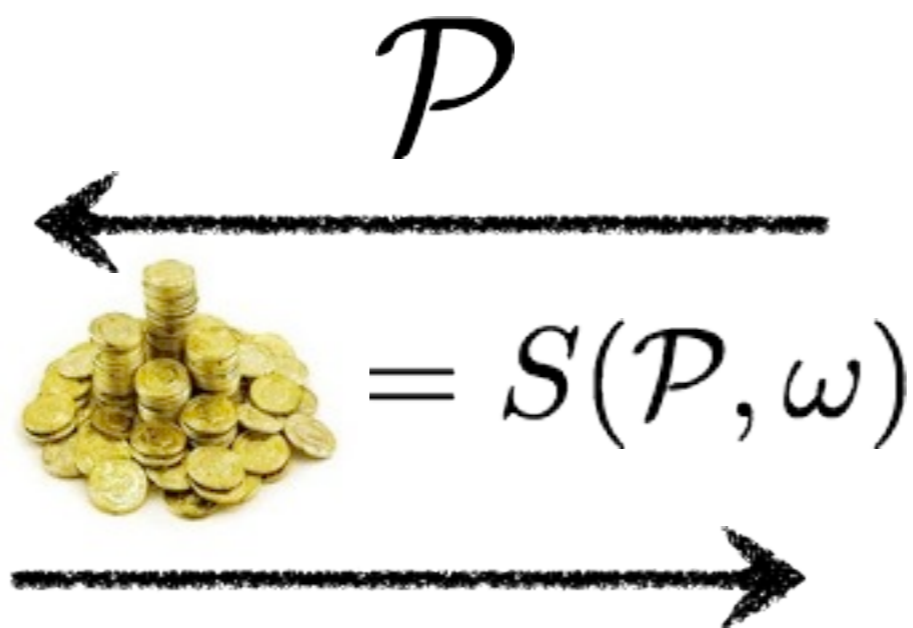


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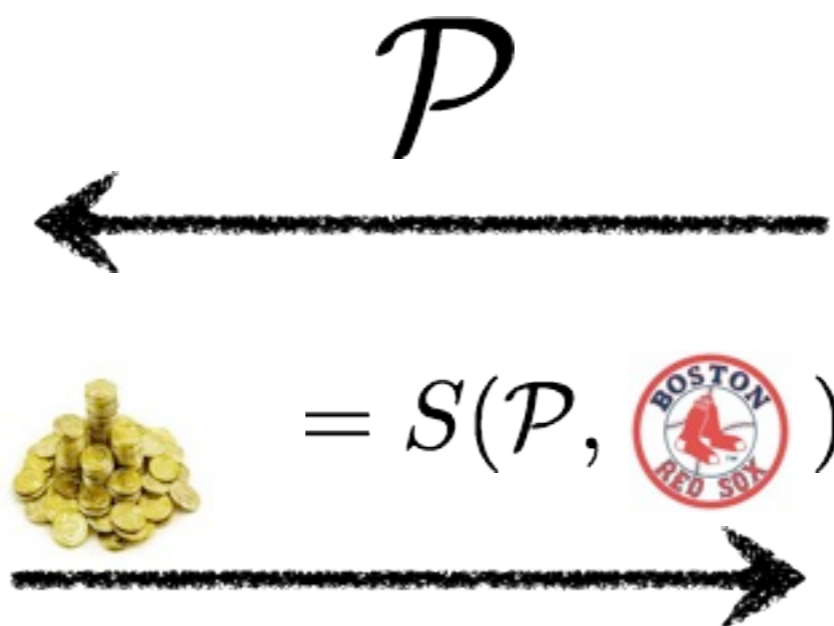


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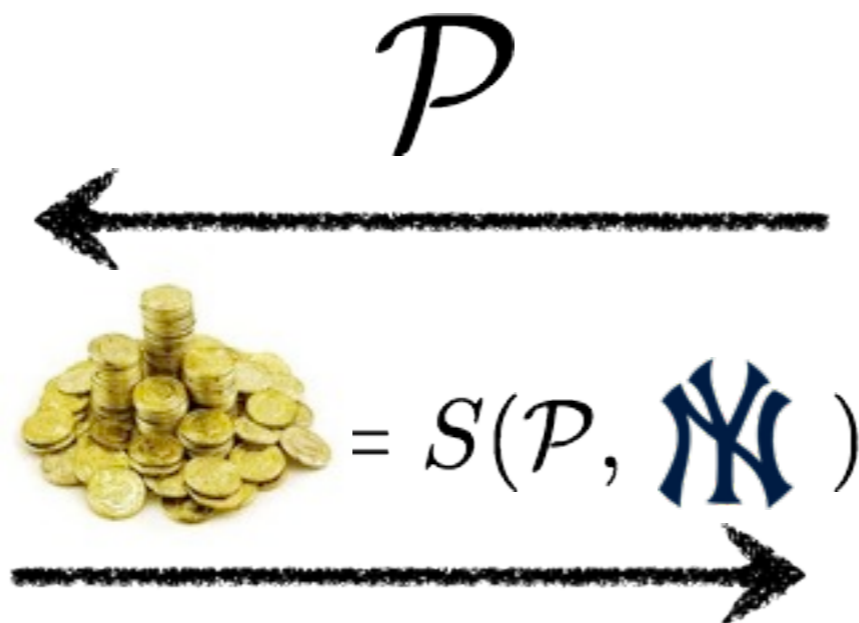


# Proper Scoring Rules

$$\Omega = \{ \quad , \mathbb{N} \} , \mathcal{D} \in \Delta(\Omega)$$

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$$\begin{aligned} \mathcal{D}(\text{Boston}) &= 60\% \\ \mathcal{D}(\text{New York}) &= 40\% \end{aligned}$$



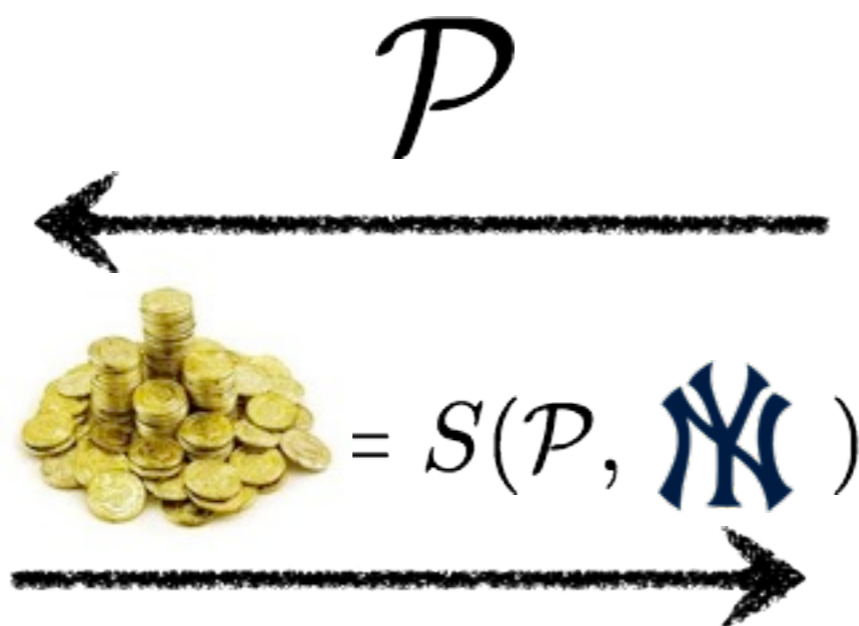


# Proper Scoring Rules

$$\Omega = \{ \text{Boston}, \text{New York} \}, \mathcal{D} \in \Delta(\Omega)$$

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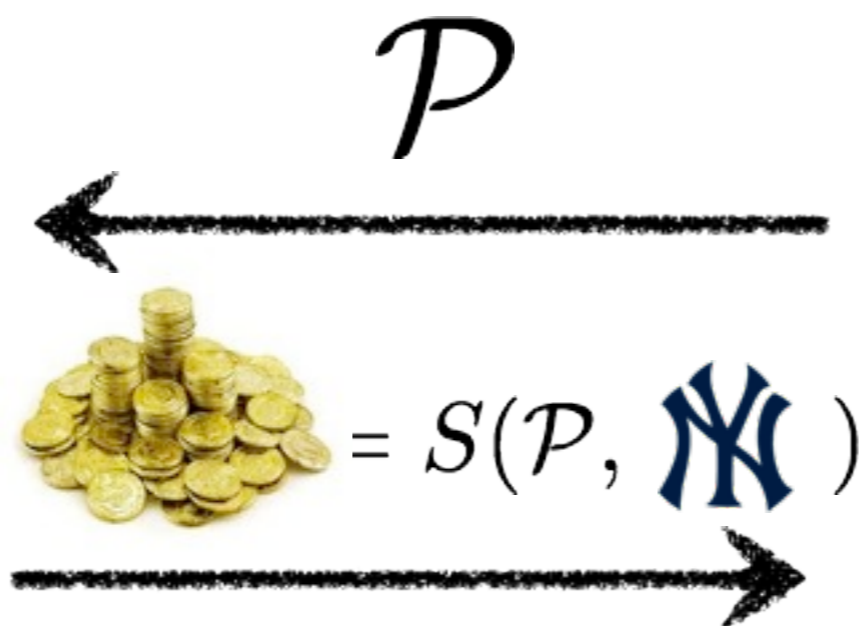
$$60\% \cdot S(\mathcal{P}, \text{Boston}) + 40\% S(\mathcal{P}, \text{NY})$$

# Proper Scoring Rules

$$\Omega = \{ \text{Boston}, \text{NY} \}, \mathcal{D} \in \Delta(\Omega)$$

$$\omega \leftarrow \mathcal{D}$$

$$\begin{aligned} \mathcal{D}(\text{Boston}) &= 60\% \\ \mathcal{D}(\text{New York}) &= 40\% \end{aligned}$$



$$\max_{\mathcal{P}} [ 60\% \cdot S(\mathcal{P}, \text{Boston}) + 40\% S(\mathcal{P}, \text{NY}) ]$$

# #P Problems

Input:  $M : \{0, 1\}^n \times \{0, 1\}^{n^c} \rightarrow \{0, 1\}$   
 $x \in \{0, 1\}^n$

$\#\{y : M(x, y) = 1\} ?$

$2^{301} + 13$



# #P Problems

Input:  $M : \{0, 1\}^n \times \{0, 1\}^{n^c} \rightarrow \{0, 1\}$   
 $x \in \{0, 1\}^n$

$\Pr_y[M(x, y) = 1] ?$

$$\frac{2^{301} + 13}{2^{n^c}}$$



Reduce the problem to question about probabilities

# #P Problems

Input:  $M : \{0, 1\}^n \times \{0, 1\}^{n^c} \rightarrow \{0, 1\}$   
 $x \in \{0, 1\}^n$

$\Pr_y[M(x, y) = 1] ?$

$$\frac{2^{301} + 13}{2^{n^c}}$$



Merlin knows  $q = \Pr_y[M(x, y) = 1]$   
Need to incentivize him to reveal  $q$

# Our Rational Proof for #P

$$\Omega = \{0, 1\}, \mathcal{D} \in \Delta(\Omega)$$

$$\mathcal{D}(1) = q$$

$$\mathcal{D}(0) = 1 - q$$



# Our Rational Proof for #P

$$\Omega = \{0, 1\}, \mathcal{D} \in \Delta(\Omega)$$

$$\mathcal{D}(1) = \Pr_y[M(x, y) = 1]$$

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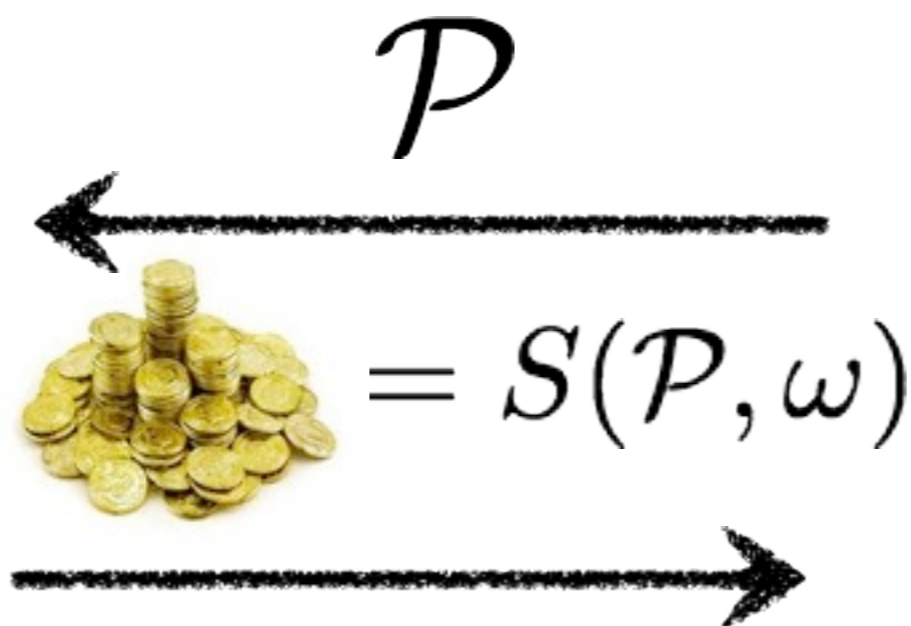
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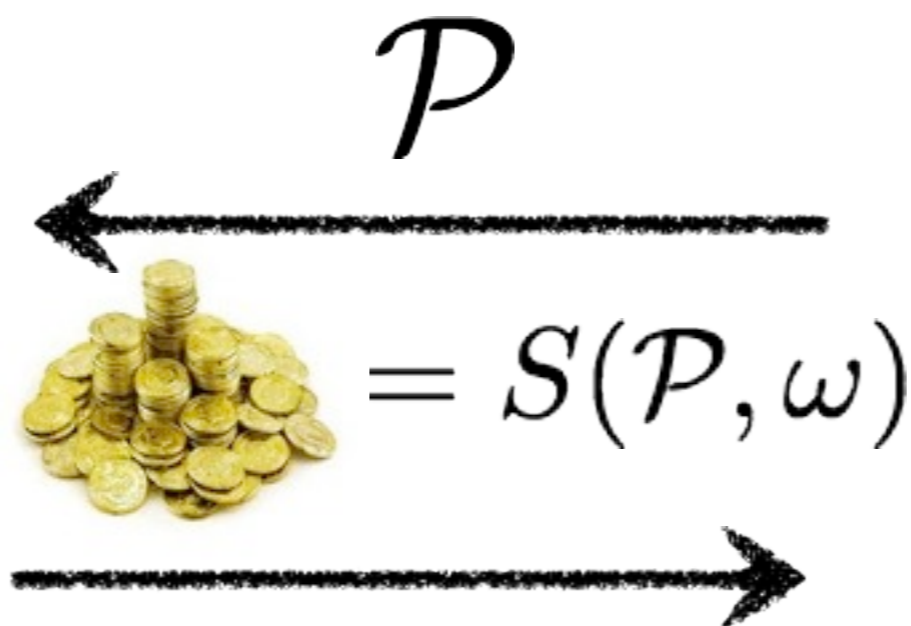
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$$\mathcal{D}(0) = 1 - q$$



$$\mathcal{D} = \operatorname{argmax}_{\mathcal{P}} \{q \cdot S(\mathcal{P}, 1) + (1 - q) \cdot S(\mathcal{P}, 0)\}$$

# Theorem 1

$$\#P \subset RMA[1]$$

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Zero-Knowledge Rational Proof!

# Theorem 1

$$\#P \subset RMA[1]$$

Zero-Knowledge Rational Proof!

Computationally Sound Rational Proof!



# Theorem 2

$$RMA[1] \subset P^{NP\#P}$$

Thank you Lance!

# Theorem 2

$$RMA[1] \subset P^{NP\#P}$$

*There are things money can't buy*

Thank you Lance!

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$$RMA[1] \subset P^{NP\#P}$$

*Economics View: Computational Limit on Contracts*

Thank you Lance!

# Counting Hierarchy

$$CH = CP_0 \cup CP_1 \cup CP_2 \cup \dots$$

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$$CP_2 = PP^{CP_1} = PP^{PP}$$

# Counting Hierarchy

$$CH = CP_0 \cup CP_1 \cup CP_2 \cup \dots$$

$$CP_0 = P$$

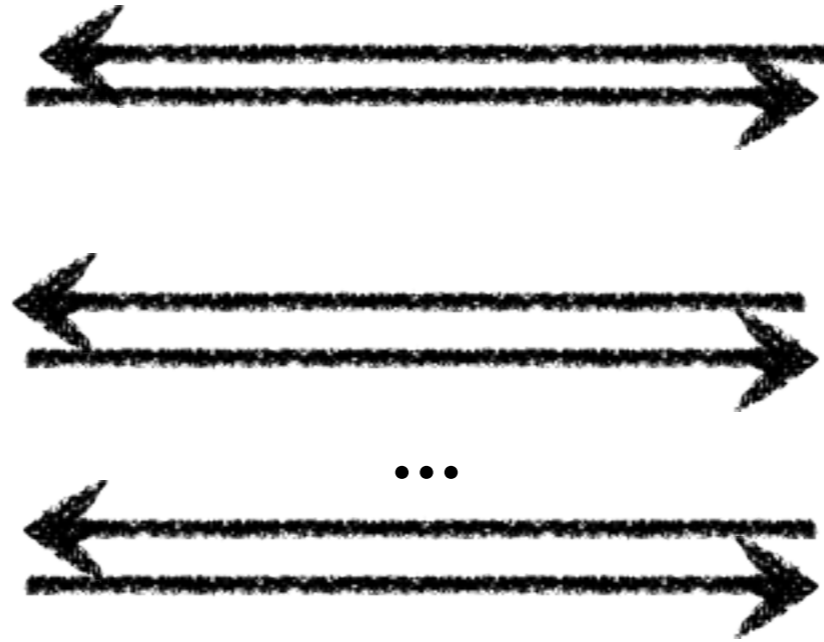
$$CP_1 = PP$$

$$CP_2 = PP^{CP_1} = PP^{PP}$$

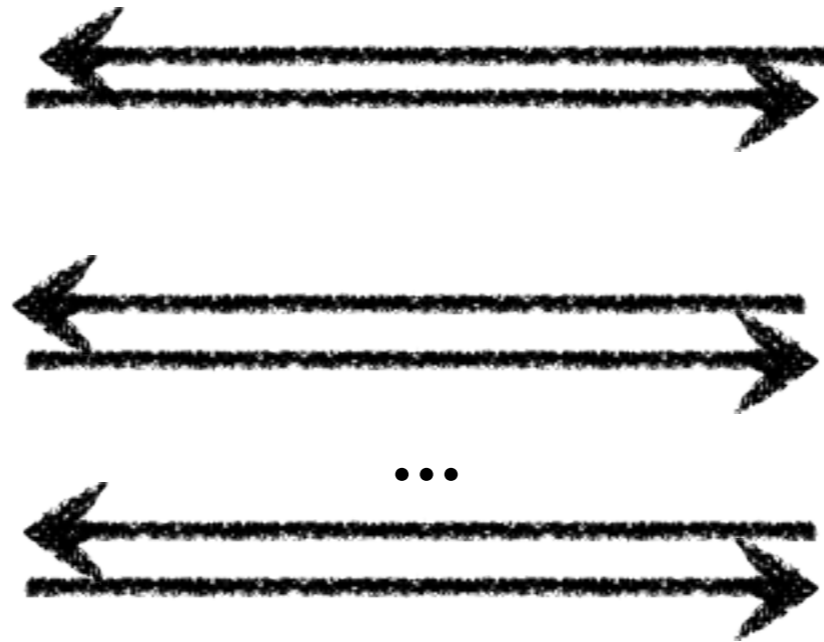
$$CP_k = PP^{CP_{k-1}} = PP^{PP \dots PP}$$



# Theorem 3

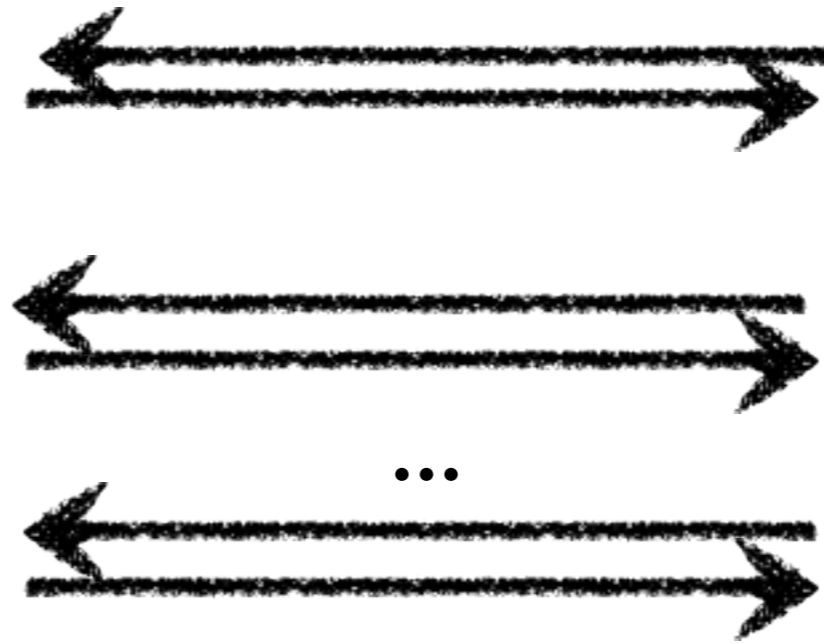


# Theorem 3



$$CP_k \subset RMA[k] \subset CP_{2k+1}$$

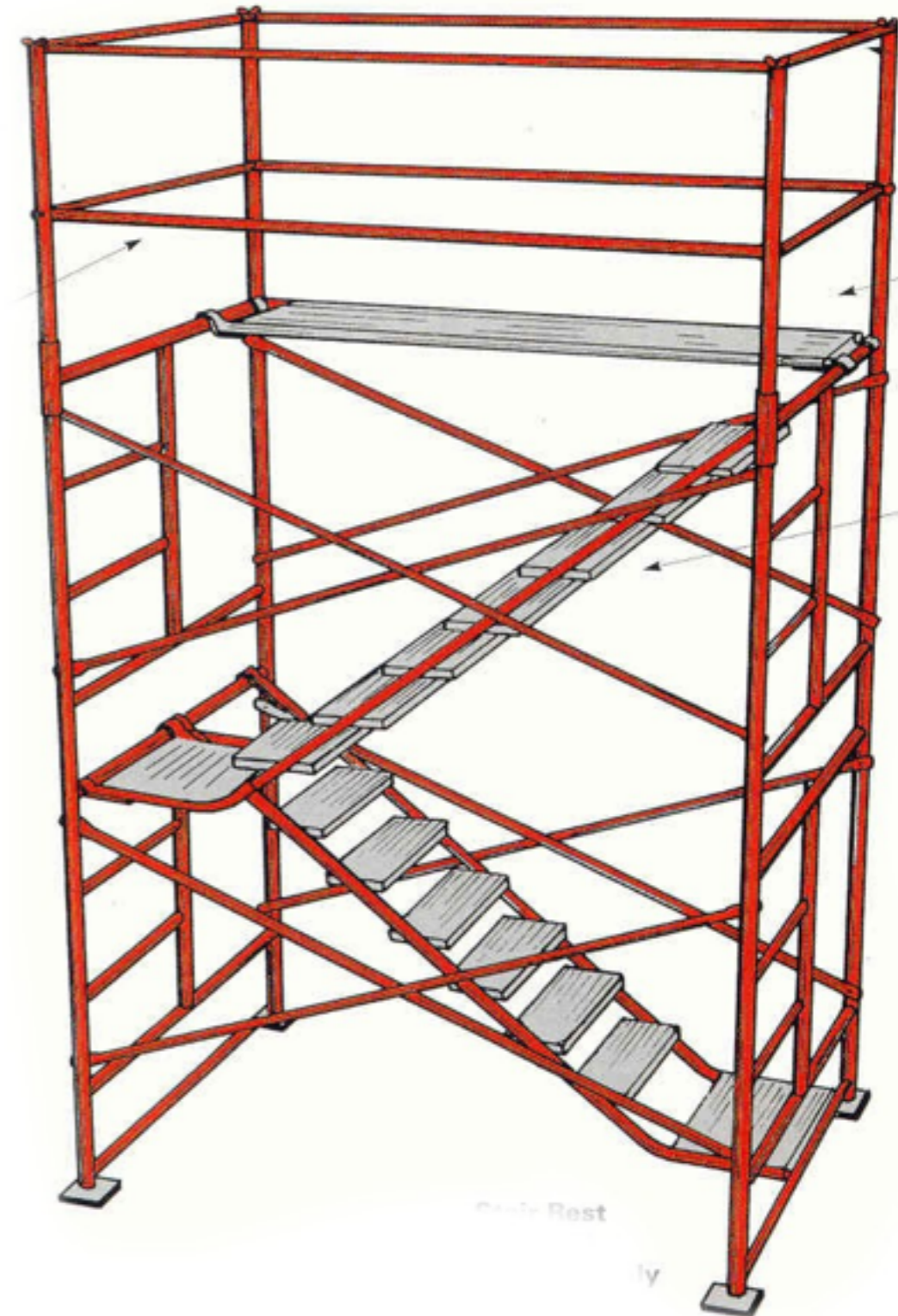
# Theorem 3



$$RMA = CH$$

# Open Question

Does CH Collapse?



# Old Analogy

Q: Does CH Collapse?

A: Not if it behaves like PH

$NP^{NP\dots NP}$   
...  
 $NP^{NP}$   
 $NP$

$PP^{PP\dots PP}$   
...  
 $PP^{PP}$   
 $PP$

# New Analogy

Q: Does CH Collapse?

A: Yes if it behaves like AM

$AM[k]$

...

$AM[2]$

$AM[1]$

$PP^{PP\dots PP}$

...

$PP^{PP}$

$PP$

# Summary of Contributions

- New Complexity Class RMA
- Short Rational Proofs for #P
- Constant-Round Rational Proofs = CH

**THANK YOU!**