

# Towards Characterizing Complete Fairness in Secure Two-Party Computation

**Gilad Asharov**

**TCC 2014**



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**B / U**

# Secure Multiparty Computation

$n$  parties, each has some private input, wish to compute a function on their **joint** inputs

- average of salaries, auctions, private database query, private data mining

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Security should be preserved even when some of the parties are **corrupted**

- correctness, privacy, independence of inputs and.. **fairness**

# Complete Fairness

If the adversary learns the output, then all parties should learn also

- In some sense, parties receive outputs simultaneously

$P_X$

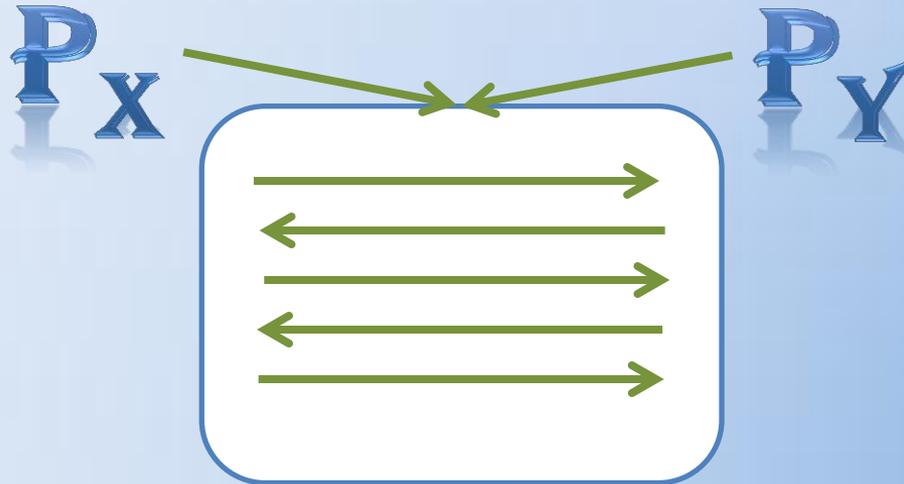
$P_Y$



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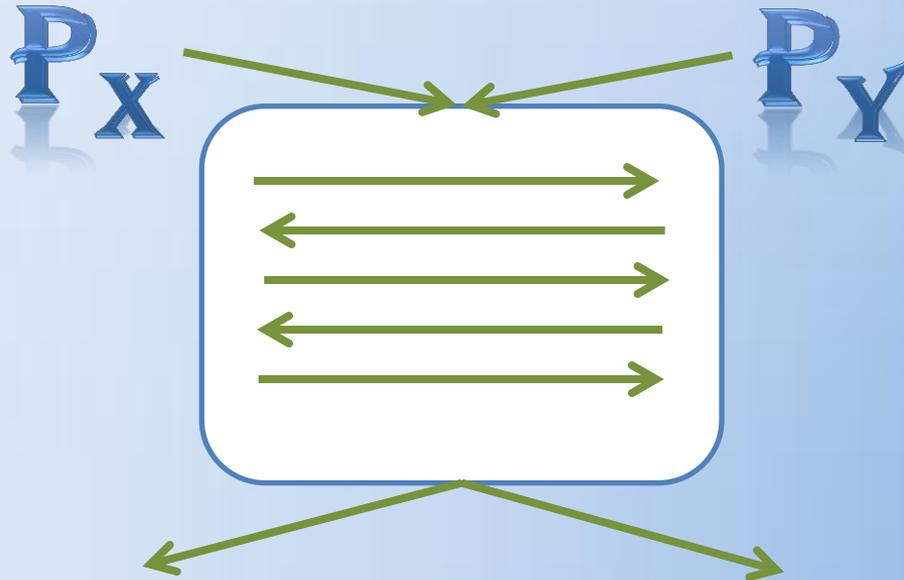
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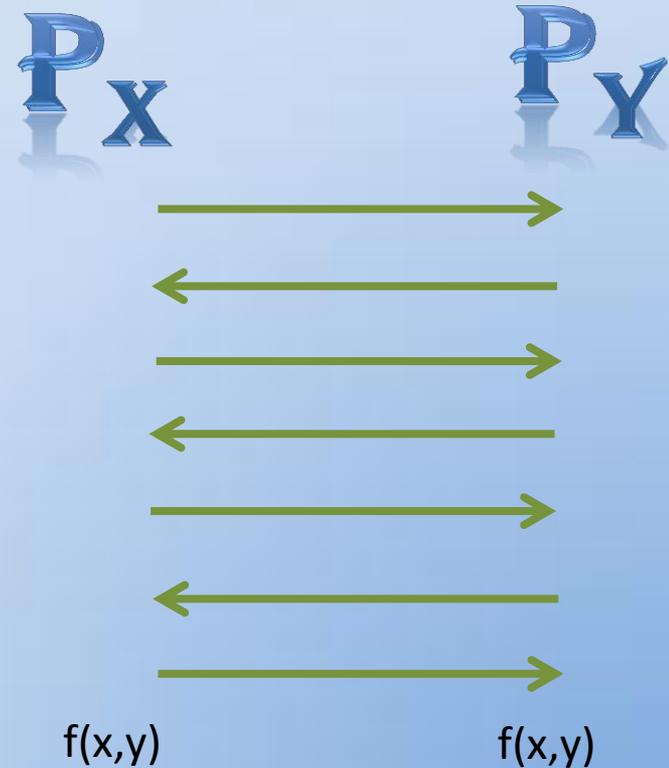


# Complete Fairness

- **Complete fairness** can be achieved in multiparty with honest majority  
[GMW87,BGW88,CCD88,RB89,Be91]
- What about no honest majority?
  - Special case: *Two party setting*?

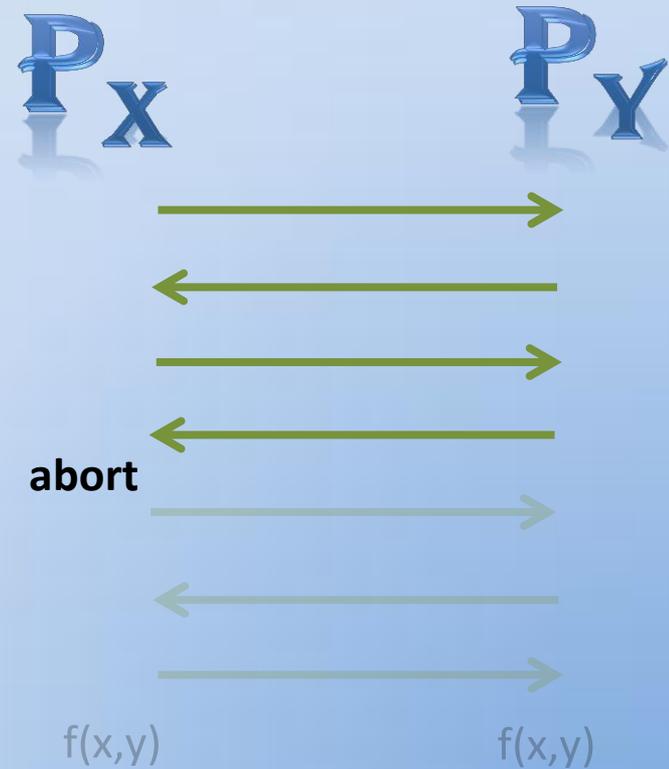
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- Beginning of execution – no knowledge about the outputs
- End of execution – full knowledge about it
- Protocols proceed in rounds
- The parties cannot exchange information simultaneously



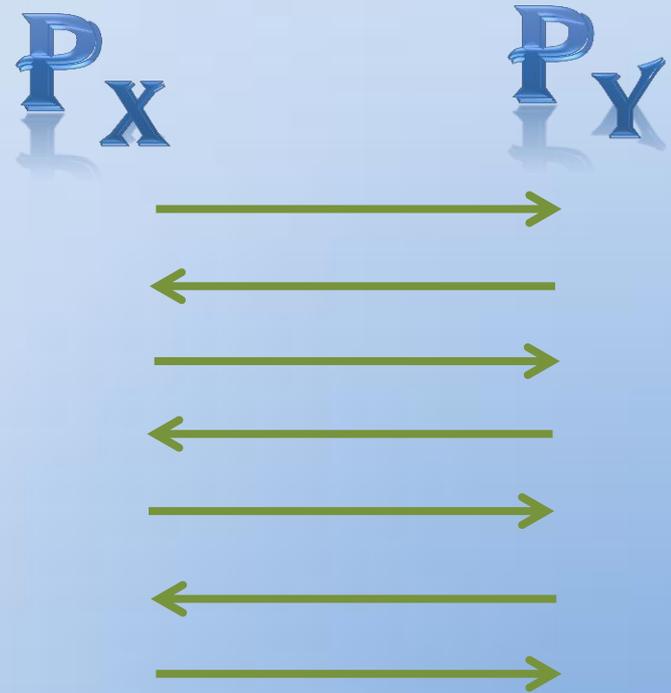
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- There must be a point when a party knows more than the other



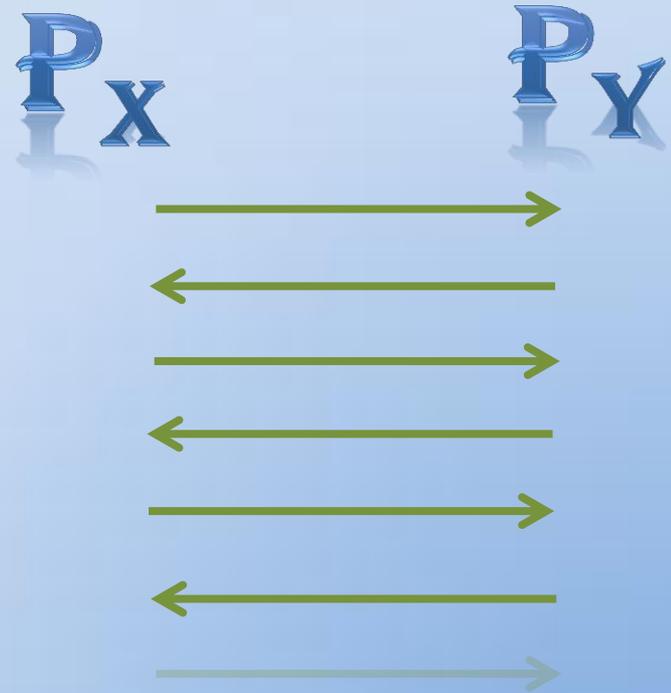
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- Take a fair protocol
- Remove the last round  
-> still fair protocol
- Continue the process..
- We stay with an empty protocol



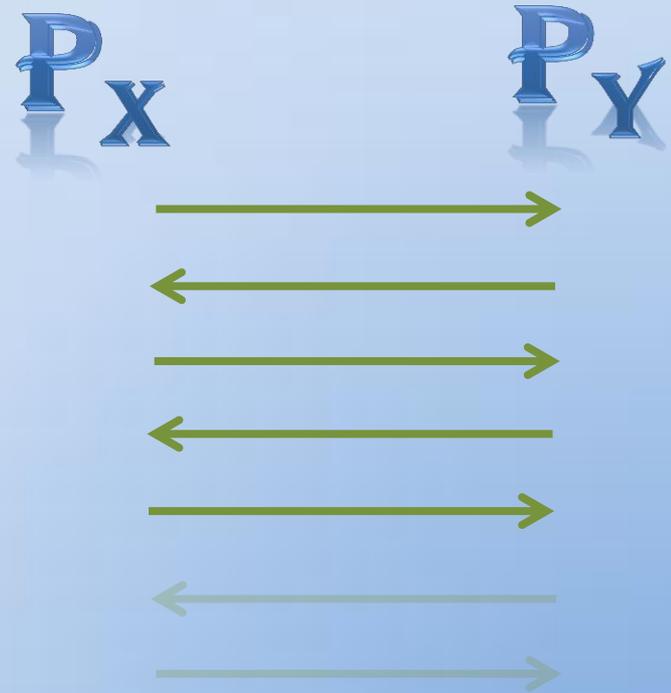
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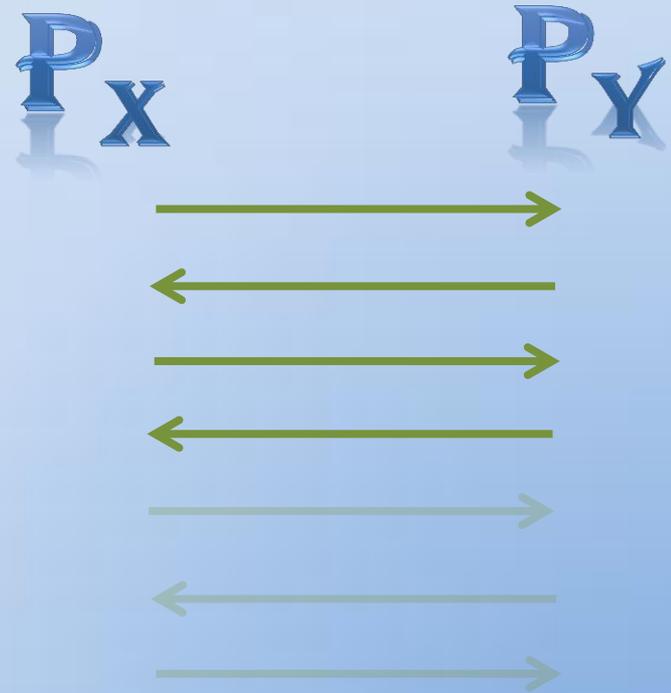
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  - both parties **agree** on the same uniform bit
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- The coin-tossing functionality is impossible:
  - both parties **agree** on the same uniform bit
  - **no** party can **bias** the result
- Implies that the boolean XOR function is also impossible

	$y_1$	$y_2$
$x_1$	<b>0</b>	<b>1</b>
$x_2$	<b>1</b>	<b>0</b>

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  - Gradual release , Probabilistic fairness, Optimistic exchange, fairness at expectation  
[BeaverGoldwasser89][GoldwasserLevin90]  
[BonehNaor2000][Micali98]...

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  - Gradual release , Probabilistic fairness, Optimistic exchange, fairness at expectation  
[BeaverGoldwasser89][GoldwasserLevin90]  
[BonehNaor2000][Micali98]...
- Even two definitions of security – one with fairness, one without
- For two decades – no results on **complete fairness**

# Complete Fairness

Gordon, Hazay, Katz and Lindell [STOC08] showed that there exist **some non-trivial** functions that can be computed with **complete fairness!**

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	$Y_1$	$Y_2$	$Y_3$	$Y_4$	$Y_5$
$x_1$	0	0	0	0	0
$x_2$	1	0	0	0	0
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	$Y_1$	$Y_2$
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# Characterizing Fairness

- **A fundamental question:**

**What functions can and cannot be securely computed with complete fairness?**

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# Characterizing Fairness

- **A fundamental question:**

**What functions can and cannot be securely computed with complete fairness?**

- **Impossibility: Cleve**
- Only few examples of functions that are possible

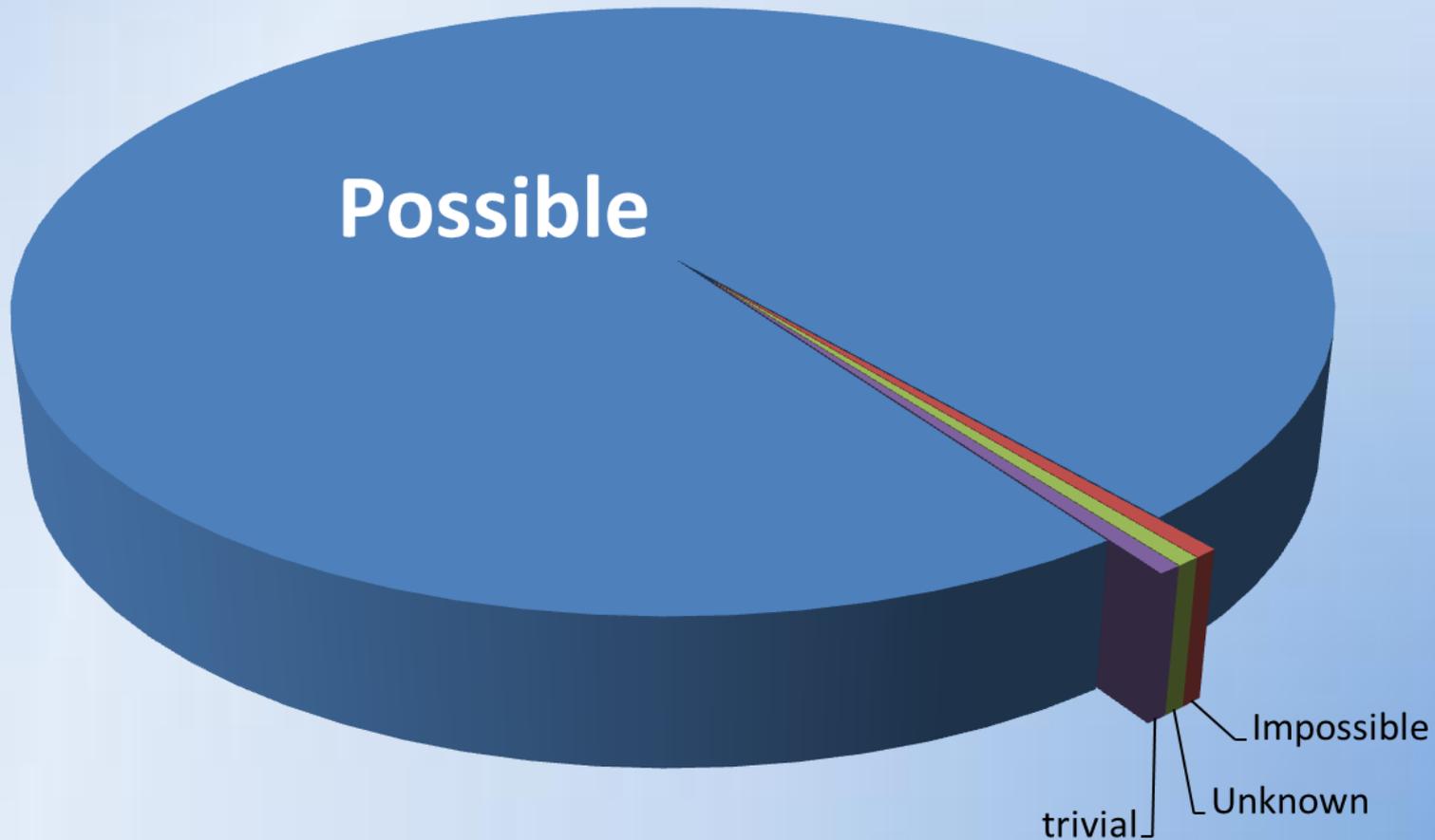
# Two Works

- **A Full Characterization of Functions that Imply Fair Coin Tossing and Ramifications to Fairness**  
A, Lindell and Rabin [TCC 2013]
- **Towards Characterizing Complete Fairness in Secure Two-Party Computing**  
A [TCC 2014]

$f: X \times Y \rightarrow \{0,1\}$   
with  $|X| \neq |Y|$

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# Examples

## Set Membership

- **X input:**  $S \subseteq \Omega$  (possible inputs:  $2^{|\Omega|}$ )
- **Y input:**  $\omega \in \Omega$  (possible inputs:  $|\Omega|$ )
- The function  $f(S, \omega) = \omega \in S?$

# Examples

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## Private Evaluation of a Boolean Function

- **X input:**  $g \in F$  ( $F = \{g: \Omega \rightarrow \{0,1\}\}$ )
- **Y input:**  $y \in \Omega$
- The function  $f(g, y) = g(y)$

# Examples

## **Private Matchmaking:**

- X holds set of preferences (“what I am looking for”)
- Y holds a profile (“who I am”)
- Output: Does Y match X

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- Y holds  $B \subseteq \Omega$
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## $A \subseteq B$ :

- X holds  $A \subseteq \Omega$
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- Output:  $A \subseteq B$ ?

## Set Disjointness:

- X holds  $A \subseteq \Omega$
- Y holds  $B \subseteq \Omega$
- Output:  $A \cap B = \emptyset$ ?

# Examples

$$\begin{pmatrix} 1 & \mathbf{0} & \mathbf{0} & \mathbf{0} \\ 0 & 1 & \mathbf{0} & \mathbf{0} \\ 0 & 0 & 1 & \mathbf{0} \\ 0 & 0 & 0 & 1 \end{pmatrix}$$

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**Impossible**

$$A = B$$

implies coin-tossing

[ALR13]

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**Possible**

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**Unknown**

not coin-tossing  
not [GHKL08]\*

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**Possible**

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# **A Full Characterization of Functions that Imply Fair Coin Tossing and Ramifications to Fairness**

Asharov, Lindell, Rabin

**TCC 2013**

# Coin-Tossing Impossibility [Cleve86]

The coin-tossing functionality is impossible:

$$f(\lambda, \lambda) = (U, U)$$

( $U$  is the uniform distribution over  $\{0,1\}$ )

- both parties **agree** on the same uniform bit
- **no** party can **bias** the result



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## Question:

Which Boolean functions are ruled out by this impossibility?

Which functions imply fair coin-tossing?

# The XOR Function

	$y_1$	$y_2$
$x_1$	<b>0</b>	<b>1</b>
$x_2$	<b>1</b>	<b>0</b>

## Question:

Assume a fair protocol for the XOR function  
How can we use it to toss a coin?

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## Question:

Assume a fair protocol for the XOR function  
How can we use it to toss a coin?

## Answer:

Each party chooses a uniform bit, then XOR them

# Why Does it Work?

$$\Pr[\textit{output} = 1] = \underbrace{(p_1 \quad p_2)}_{\text{distribution over the inputs of } \mathbf{X}} \begin{pmatrix} 0 \\ 1 \end{pmatrix} \begin{pmatrix} 1 \\ 0 \end{pmatrix} \underbrace{\begin{pmatrix} q_1 \\ q_2 \end{pmatrix}}_{\text{distribution over the inputs of } \mathbf{Y}}$$

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$$\begin{pmatrix} \frac{1}{2} & \frac{1}{2} \end{pmatrix} \begin{pmatrix} 0 & 1 \\ 1 & 0 \end{pmatrix} = \begin{pmatrix} \frac{1}{2} & \frac{1}{2} \end{pmatrix}$$

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# The Property

$f$  is  $\delta$  balanced

if there exist probability vectors  $\mathbf{p} = (p_1, \dots, p_m)$ ,  
 $\mathbf{q} = (q_1, \dots, q_\ell)$  and  $0 < \delta < 1$  s.t:

$$\mathbf{p} \cdot M_f = \delta \cdot \mathbf{1}_\ell \quad \text{AND} \quad M_f \cdot \mathbf{q}^T = \delta \cdot \mathbf{1}_m^T$$

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## Theorem

If  $f$  is  $\delta$ -balanced then it implies fair coin-tossing

# Other Examples

## Balanced Functions:

$$\begin{pmatrix} 1 & 0 \\ 0 & 1 \end{pmatrix} \quad \begin{pmatrix} 1 & 0 & 0 \\ 0 & 1 & 0 \\ 0 & 0 & 1 \end{pmatrix} \quad \begin{pmatrix} 1 & 0 & 1 \\ 0 & 1 & 0 \\ 0 & 0 & 1 \end{pmatrix}$$

## Unbalanced Functions:

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(left-balanced, right-unbalanced)

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## Unbalanced Functions:

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(left-balanced, right-unbalanced)

# This is Tight!\*

## Theorem

if  $f$  is not  $\delta$ -balanced for any  $0 < \delta < 1$ , then it **does not imply** coin tossing\*

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- Unlike Cleve – here we do have something simultaneously. A completely different argument is given
- **Caveat:** the adversary is **inefficient**
- However, impossibility holds also when the parties have OT-oracle (and so commitments, ZK, etc.)

# Towards Characterizing Complete Fairness in Secure Two-Party Computation

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# The Protocol of [GHKL08]

Gordon, Hazay, Katz and Lindell [STOC08] presented a general protocol and proved that a particular function can be computed using this protocol

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$x_1$	<b>0</b>	<b>1</b>
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## Question:

What functions can be computed using this protocol?

# The Result

- **Almost all functions with  $|X| \neq |Y|$ :**  
can be computed using the protocol
- **Almost all functions with  $|X| = |Y|$ :**  
cannot be computed using the protocol
  - If the function has monochromatic input, it may be possible even if  $|X| = |Y|$
- **Characterization of [GHKL08] is not tight!**
  - There are functions that are left unknown

# The Protocol of [GHKL08]

- Special round  $i^*$
- Until round  $i^*$  - the outputs are random and uncorrelated  $(f(x, \hat{y}), f(\hat{x}, y))$
- Starting at  $i^*$  - the outputs are correct
- At  $i^*$ ,  $P_x$  learns before  $P_y$

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- Starting at  $i^*$  - the outputs are correct
- At  $i^*$ ,  $P_x$  learns before  $P_y$
- Security:
  - $P_y$  is always the **second** to receive output
    - Simulation is possible for **all** functions
  - $P_x$  is always the **first** to receive output
    - Simulation is possible only for **some** functions

# The Definition

**P<sub>x</sub>**

**P<sub>y</sub>**

**Trusted Party**

# The Definition

$P_x$

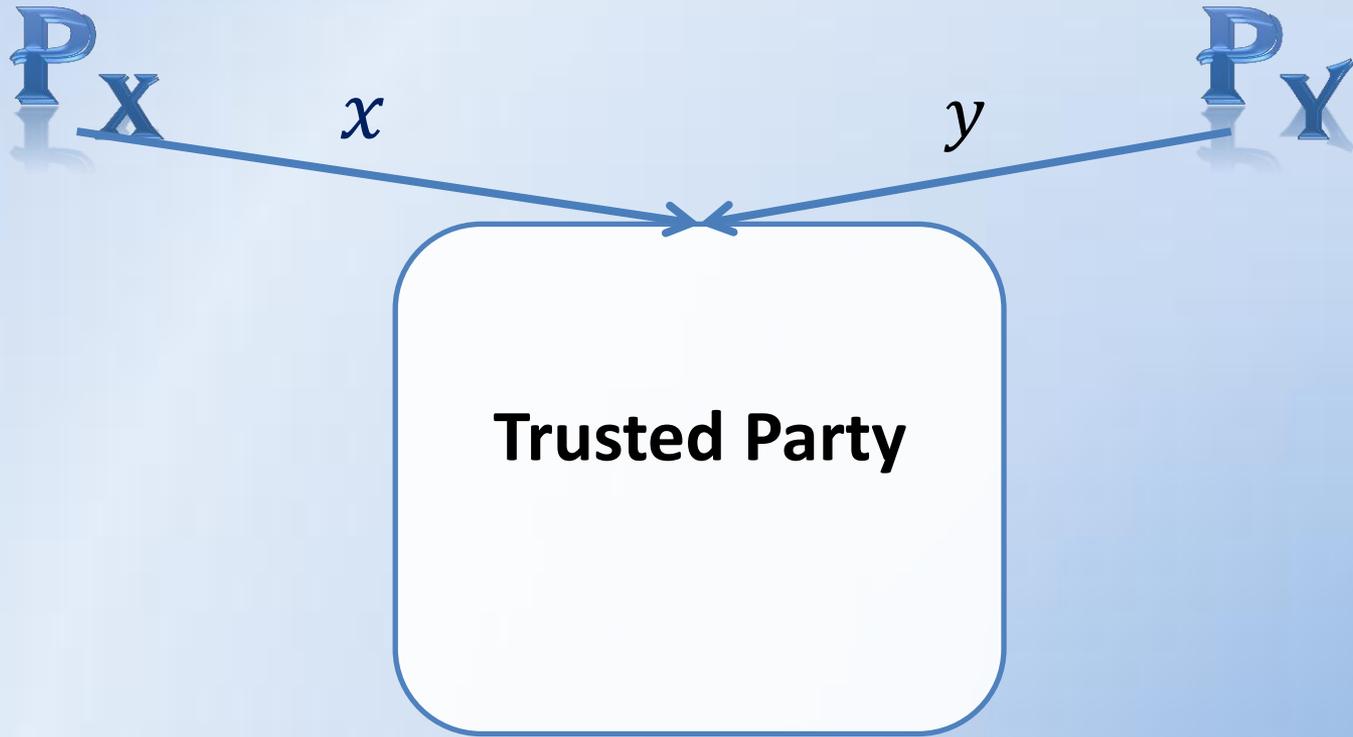
$P_y$

$y$

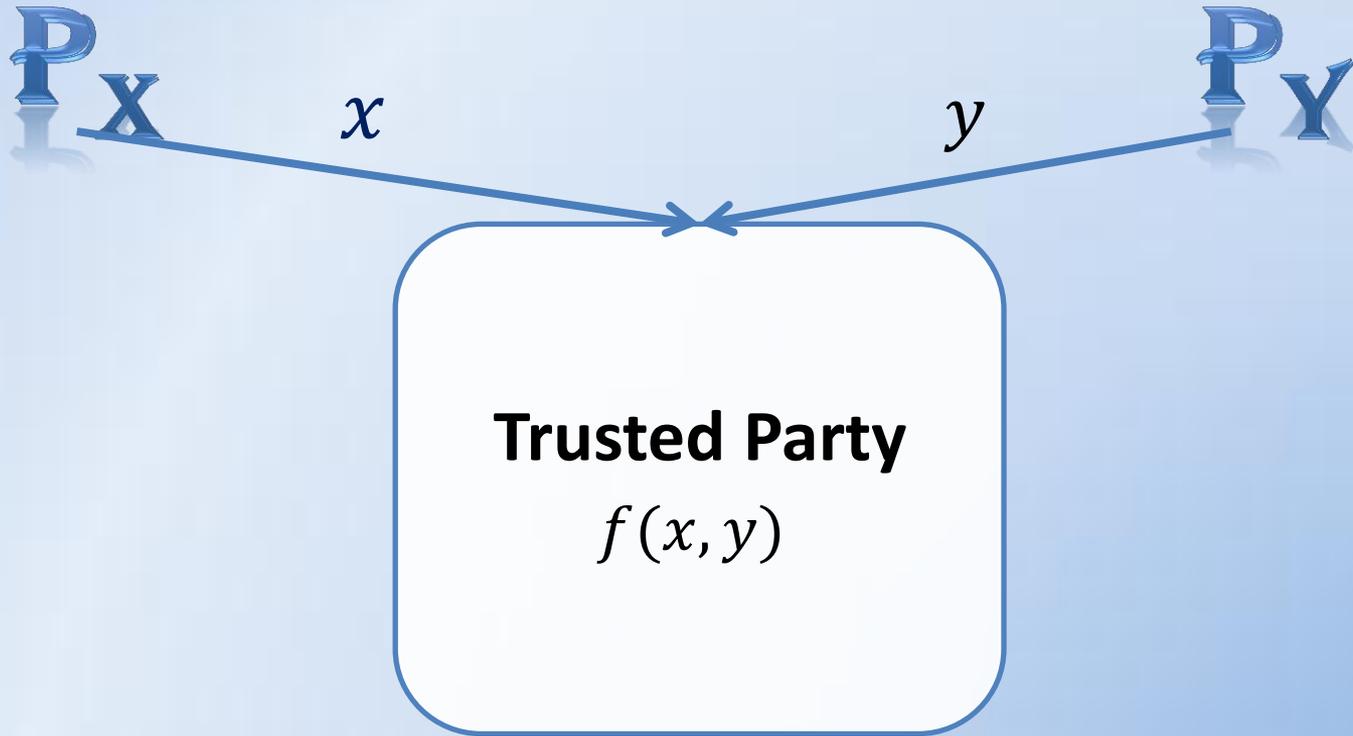


**Trusted Party**

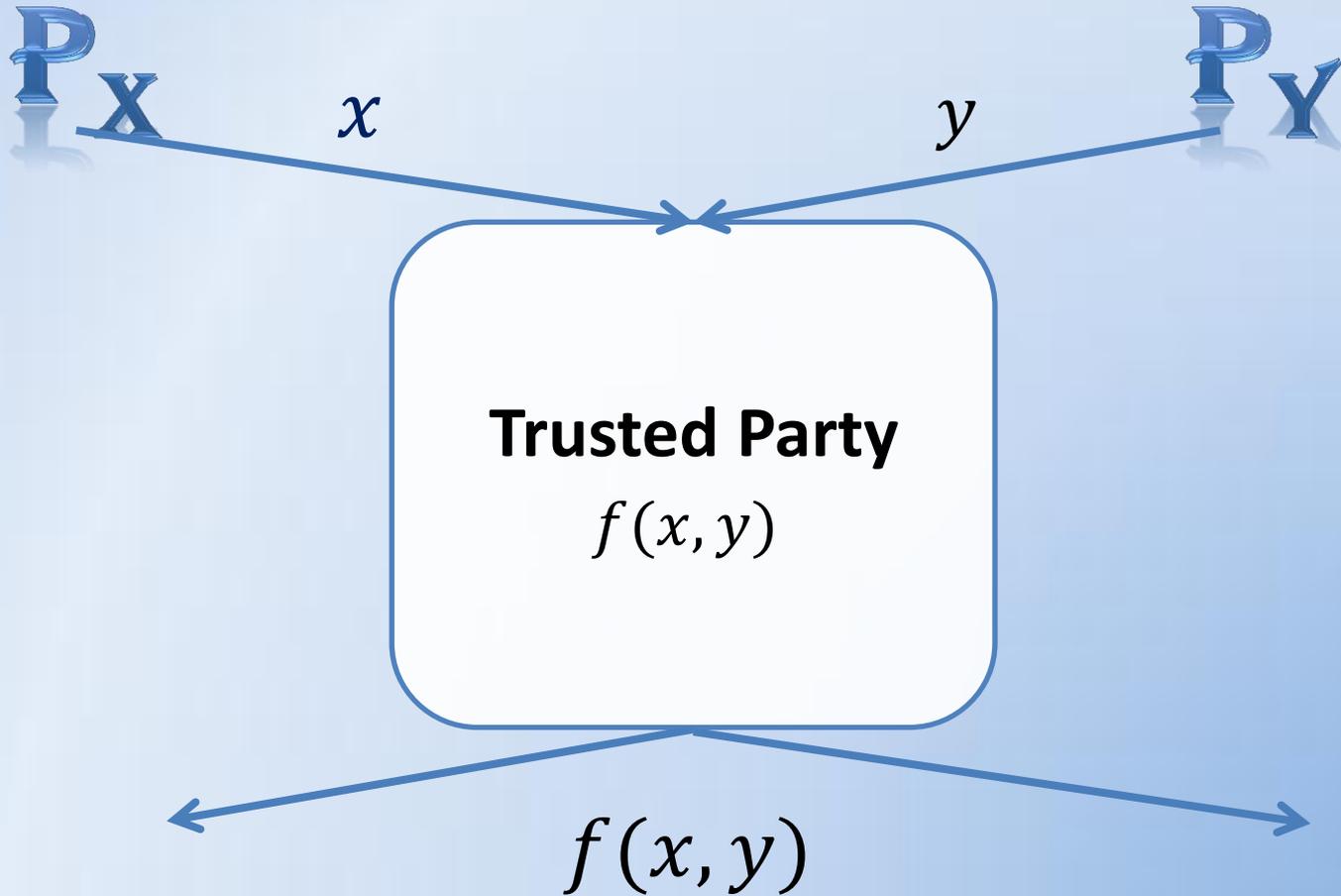
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# Manipulating Output (Possible)

Before  $i^*$  :  $f(\hat{x}, y)$

		$y_1$	$y_2$
$\frac{1}{3}$	$x_1$	<b>0</b>	<b>1</b>
$\frac{1}{3}$	$x_2$	<b>1</b>	<b>0</b>
$\frac{1}{3}$	$x_3$	<b>1</b>	<b>1</b>

$(\frac{2}{3}, \frac{2}{3})$

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$1/3$	$x_3$	<b>1</b>	<b>1</b>

$$\left(\frac{2}{3}, \frac{2}{3}\right)$$
$$\left(\frac{2}{3} + \epsilon, \frac{2}{3}\right)$$

# Manipulating Output (Possible)

Before  $i^*$  :  $f(\hat{x}, y)$

			$y_1$	$y_2$
$1/3 - \epsilon$	$1/3$	$x_1$	<b>0</b>	<b>1</b>
$1/3$	$1/3$	$x_2$	<b>1</b>	<b>0</b>
$1/3 + \epsilon$	$1/3$	$x_3$	<b>1</b>	<b>1</b>

$$\left(\frac{2}{3}, \frac{2}{3}\right)$$
$$\left(\frac{2}{3} + \epsilon, \frac{2}{3}\right)$$

# Manipulating Output (Possible)

Before  $i^*$  :  $f(\hat{x}, y)$

			$y_1$	$y_2$
$1/3 - \epsilon$	$1/3$	$x_1$	<b>0</b>	<b>1</b>
$1/3$	$1/3$	$x_2$	<b>1</b>	<b>0</b>
$1/3 + \epsilon$	$1/3$	$x_3$	<b>1</b>	<b>1</b>



$$\left(\frac{2}{3}, \frac{2}{3}\right)$$
$$\left(\frac{2}{3} + \epsilon, \frac{2}{3}\right)$$

# Manipulating Output (Impossible)

Before  $i^*$  :  $f(\hat{x}, y)$

		$y_1$	$y_2$
$1/2$	$x_1$	<b>0</b>	<b>1</b>
$1/2$	$x_2$	<b>1</b>	<b>0</b>

$(1/2, 1/2)$

# Manipulating Output (Impossible Function)

Before  $i^*$  :  $f(\hat{x}, y)$

		$y_1$	$y_2$
$1/2$	$x_1$	<b>0</b>	<b>1</b>
$1/2$	$x_2$	<b>1</b>	<b>0</b>
		$(1/2, 1/2)$	
		$(1/2+\epsilon, 1/2)$	

# Manipulating Output (Impossible Function)

Before  $i^*$  :  $f(\hat{x}, y)$

			$y_1$	$y_2$
$1/2$	$1/2$	$x_1$	<b>0</b>	<b>1</b>
$1/2+\epsilon$	$1/2$	$x_2$	<b>1</b>	<b>0</b>

$(1/2, 1/2)$   
 $(1/2+\epsilon, 1/2)$



# “The Power of the Ideal Adversary”

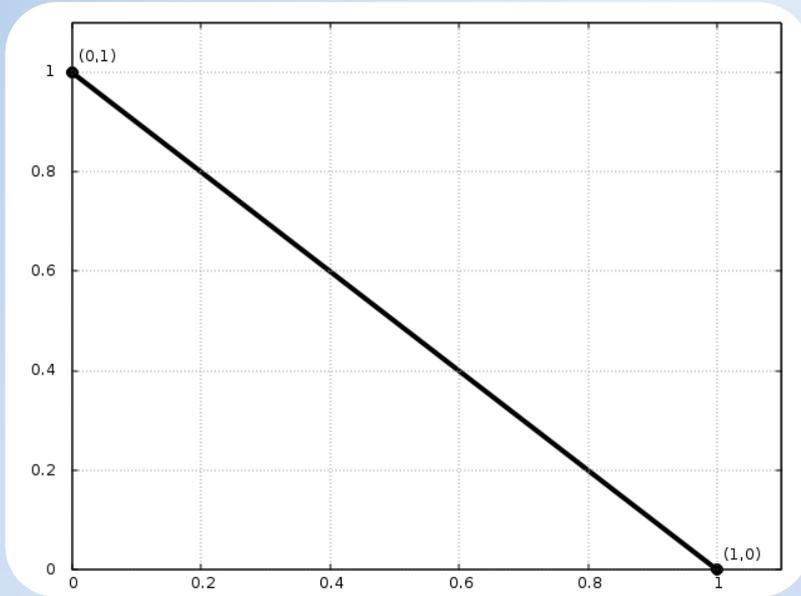
	$y_1$	$y_2$
$x_1$	<b>0</b>	<b>1</b>
$x_2$	<b>1</b>	<b>0</b>

$(1 - p, p)$

	$y_1$	$y_2$
$x_1$	<b>0</b>	<b>1</b>
$x_2$	<b>1</b>	<b>0</b>
$x_3$	<b>1</b>	<b>1</b>

$(1 - p_1, 1 - p_2)$

# “The Power of the Ideal Adversary”



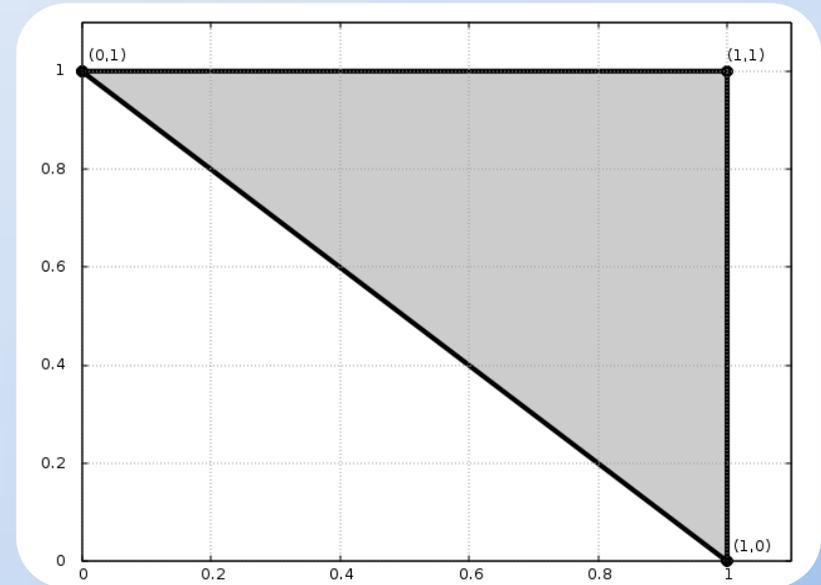
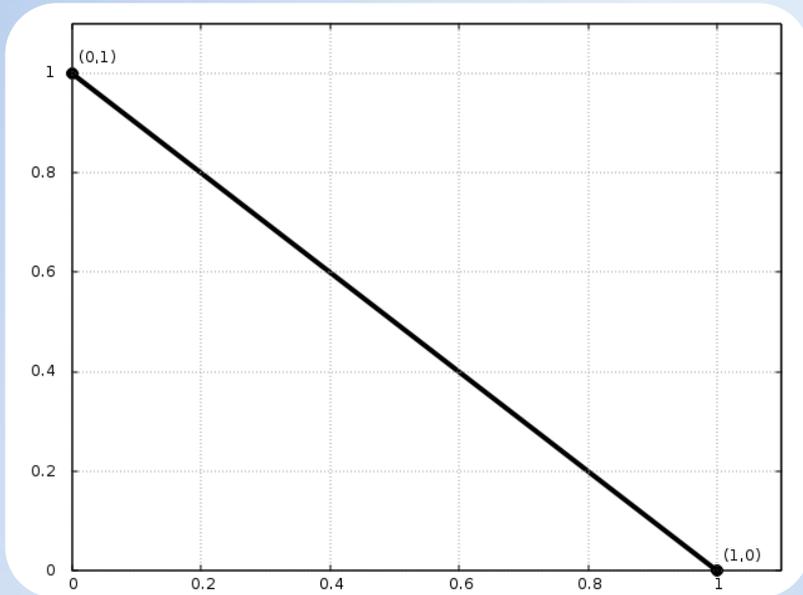
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$x_2$	<b>1</b>	<b>0</b>

$(1 - p, p)$

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$(1 - p_1, 1 - p_2)$

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$x_3$	<b>1</b>	<b>1</b>

$(1 - p_1, 1 - p_2)$

# Two Observations

## 1) **General for multiparty computation:**

“The power of the ideal adversary”

- Geometric representation

## 2) **Specific for the [GHKL08] protocol:**

Adding more rounds – less to correct!

# Second Observation: Back to the Protocol

**REAL Before  $i^*$ :**

$f(\hat{x}, y)$  for uniform  $\hat{x}$  (1/3,1/3,1/3)  
 $\Rightarrow (2/3, 2/3)$

$$E(R) = 5$$

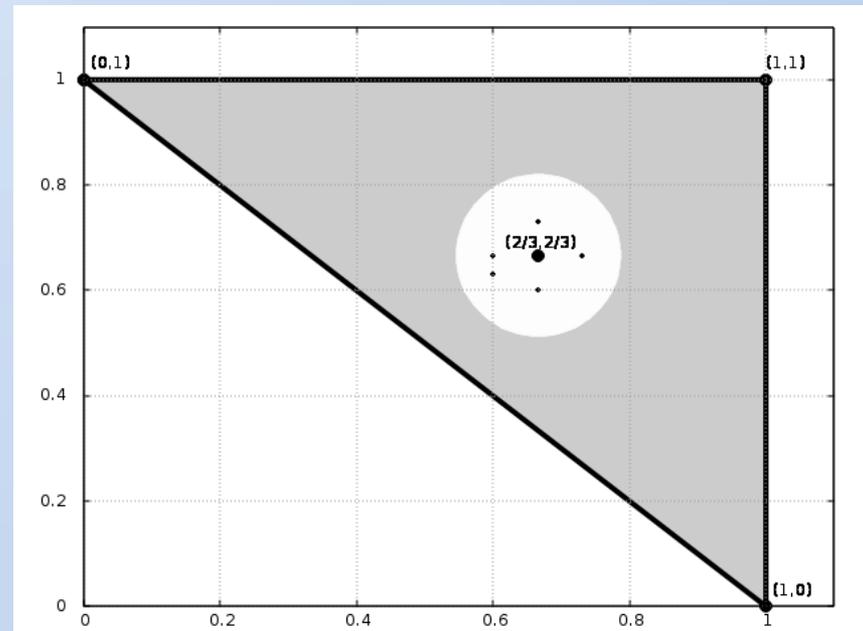
$$E(R) = 100$$

Input	$a_i$	$\tilde{X}=(x_1,x_2,x_3)$	Output
$x_1$	0	(0, 1/3, 2/3)	(1, 2/3)
$x_1$	1	(1/3, 1/2, 1/6)	(2/3, 1/2)
$x_2$	0	(1/3, 0, 2/3)	(2/3, 1/2)
$x_2$	1	(1/2, 1/3, 1/6)	(1/2, 2/3)
$x_3$	0	(-, -, -)	(-, -)
$x_3$	1	(1/3, 1/3, 1/3)	(2/3, 2/3)

Input	$a_i$	$\tilde{X}=(x_1,x_2,x_3)$	Output
$x_1$	0	(0.32, 0.33, 0.34)	(0.68, 0.67)
$x_1$	1	(0.36, 0.34, 0.32)	(0.67, 0.659)
$x_2$	0	(0.36, 0.31, 0.34)	(0.66, 0.68)
$x_2$	1	(0.34, 0.33, 0.32)	(0.65, 0.66)
$x_3$	0	(-, -, -)	(-, -)
$x_3$	1	(0.33, 0.33, 0.32)	(0.67, 0.67)

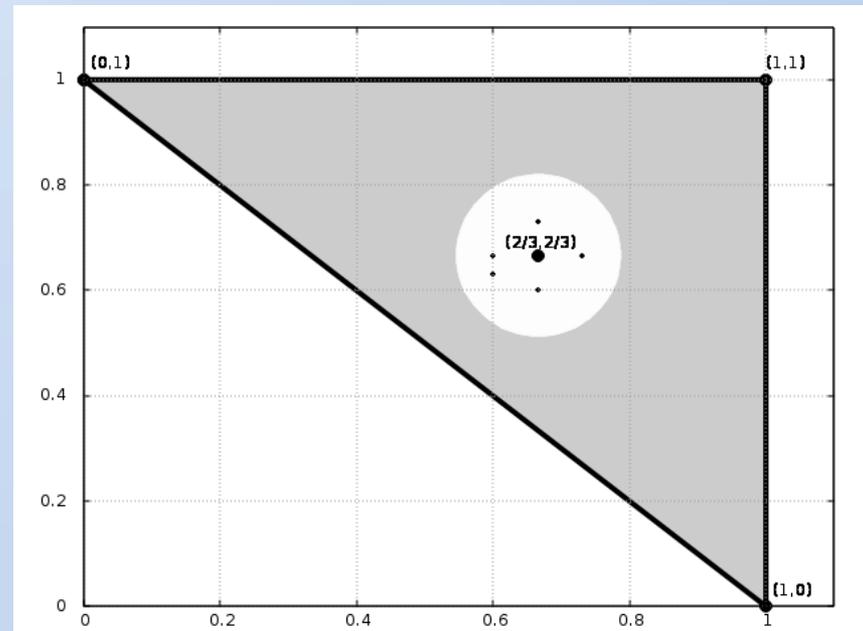
All points that the simulator needs are inside some “ball”

- **The center** – the output distribution of REAL
- **The radius** – a function of number of rounds



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# Full-Dimensional Functions

- Let  $f: \{x_1, \dots, x_\ell\} \times \{y_1, \dots, y_m\} \rightarrow \{0,1\}$
- Consider the  $\ell$  points  $X_1, \dots, X_\ell$  in  $\mathbb{R}^m$  (the “rows” of the matrix)

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## Definition

If the geometric object defined by  $X_1, \dots, X_\ell \in \mathbb{R}^m$  is of dimension  $m$ ,

Then the function is **full-dimensional**

# Our Main Theorem

## Theorem

If  $f$  is of **full-dimension**, then it can be computed with complete fairness

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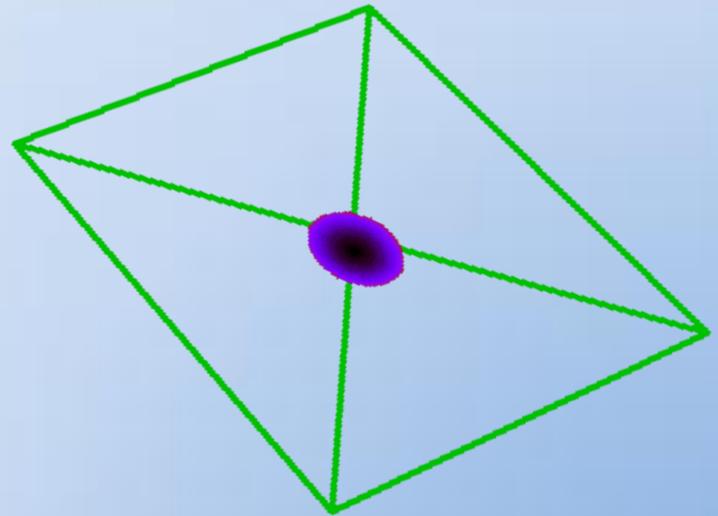
If  $f$  is of **full-dimension**, then it can be computed with complete fairness

## Proof:

- We use the protocol of [GHKL08]
- We show that all the points that the simulator needs are inside a small “ball”
- The ball is embedded inside the geometric object defined by the function

# Example in Higher Dimension

	$y_1$	$y_2$	$y_3$
$x_1$	1	0	0
$x_2$	0	1	0
$x_3$	0	0	1
$x_4$	1	1	1



# Full Dimensional and Hyperplanes

- In  $\mathbb{R}^2$  - all points do not lie on a single **LINE**
- In  $\mathbb{R}^3$  - all points do not lie on a single **PLANE**
- ...
- In  $\mathbb{R}^m$  - all points do not lie on a single **HYPERPLANE**

## Not Full-Dimensional

- In  $\mathbb{R}^2$  -  $(z_1, z_2)$   
 $\exists (q_1, q_2, \delta) \in \mathbb{R}$  s.t.  $q_1 z_1 + q_2 z_2 = \delta$ ?
- In  $\mathbb{R}^3$  -  $(z_1, z_2, z_3)$   
 $\exists (q_1, q_2, q_3, \delta) \in \mathbb{R}$  s.t.  $q_1 z_1 + q_2 z_2 + q_3 z_3 = \delta$ ?

# Equivalent Representations

- Full-dimensional function
- The function is *right-unbalanced*:
  - For every non-zero  $\mathbf{q} \in \mathbb{R}^m$ ,  $\delta \in \mathbb{R}$  it holds that:

$$M_f \cdot \mathbf{q} \neq \delta \cdot \mathbf{1}$$

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$$M_f \cdot \mathbf{q} \neq \delta \cdot \mathbf{1}$$

## Easy to Check Criterion:

No solution  $\mathbf{q}$  for:  $M_f \cdot \mathbf{q} = \mathbf{1}$

Only trivial solution for:  $M_f \cdot \mathbf{q} = \mathbf{0}$

**Balanced with respect to probability vector: IMPOSSIBLE!**

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**Unbalanced with respect to arbitrary vectors: FAIR!**

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**Unbalanced with respect to probability vector,  
balanced with respect to arbitrary vectors:**

- **If the hyperplanes do not contain the origin:**  
cannot be computed using [GHKL08]  
(with particular simulation strategy)
- **If the hyperplanes contain the origin:**  
not characterized (sometimes the GHKL protocol is possible)

**Unbalanced with respect to arbitrary vectors: FAIR!**

**CONCLUSIONS**

# On the Value $P_d$

**$P_d$ : The probability that a 0/1 matrix is singular?**

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  - **Conjecture:**  $(1/2+o(1))^d$   
(roughly the probability to have two rows that are the same)
  - **Komlos (67):**  
 $0.999^d$
  - **Tao and Vu [STOC 05]:**  
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d	$P_d$
1	0.5
5	0.627
10	0.297
15	0.047
20	0.0025
25	0.0000689
30	0.0000015

# What is the Probability that...

- The  $d + 1$  random 0/1-points in  $\mathbb{R}^d$  defines full-dimensional geometric object?
  - $1 - P_d$  (tends to 1)
- $d$  points in  $\mathbb{R}^d$  define hyperplane that passes through **0,1**?
  - $4P_d$  (tends to 0)

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  - $4P_d$  (tends to 0)

- Almost all functions with  $|X| \neq |Y|$ :  
can be computed with **complete fairness**
- Almost all functions with  $|X| = |Y|$ :  
*cannot* be computed with [GHKL08] framework

# What's Else in the Paper?

- **$d \times d$  functions with monochromatic input**

- Define hyperplanes that pass through **0** or **1**
- Almost always – possible

- **Asymmetric functions**

- $f(x, y) = (f_1, f_2)$
- If  $f_1$  or  $f_2$  are full-dimensional  $\Rightarrow$  possible!

- **Non-binary outputs  $f: X \times Y \rightarrow \Sigma$**

- General criteria, holds when  $|X|/|Y| > |\Sigma| - 1$

	$Y_1$	$Y_2$
$x_1$	0	1
$x_2$	1	0
$x_3$	1	1
$x_4$	2	0
$x_5$	1	2

# What's Next?

- The characterization is not complete
- We have a better understanding of the “power” of the **ideal** world adversary
- We have no real understanding of the “power” of the **real**-world adversary
- Open problem:
  - Finalize the characterization!
  - Almost all functions with  $|X| = |Y|$  are unknown

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**Thank you!**