

# Distributed Computing With Imperfect Randomness

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Presentation by: Daniel Thomas



# 1. Randomness



# 1. Randomness



QuickSort



# 1. Randomness



QuickSort



# 1. Randomness



QuickSort

P

< P

>= P



# 1. Randomness

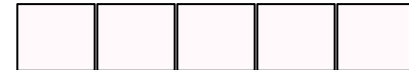


QuickSort



$< P$

$\geq P$



What If Already Sorted?

# 1. Randomness



QuickSort

P

< P

>= P



What If Already Sorted?

→ Randomized QuickSort

# 1. Randomness

Real Randomness?  
(Strong Randomness)

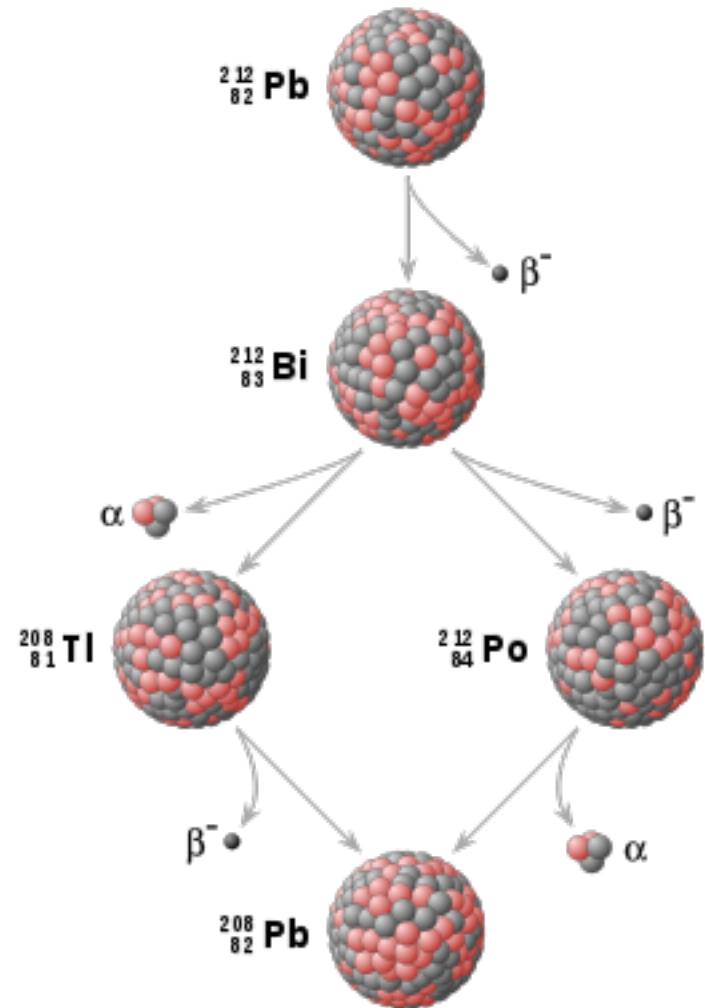




# 1. Randomness

Real Randomness?  
(Strong Randomness)

Atomic Decay?



# 1. Random

Real Ran  
(Strong F

Atomic D



# 1. Randomness

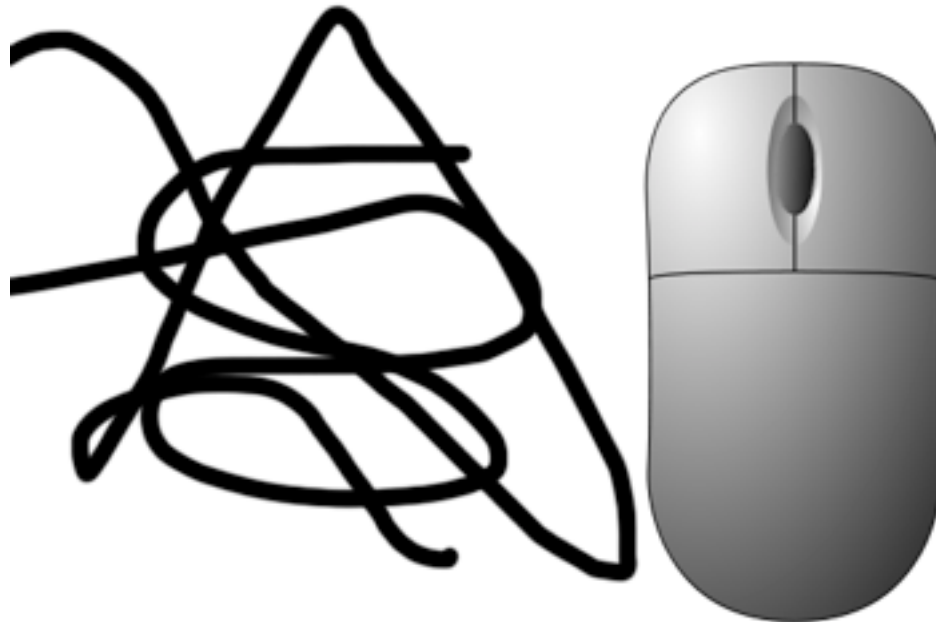
Pseudorandomness?  
(Weak Randomness?)



# 1. Randomness

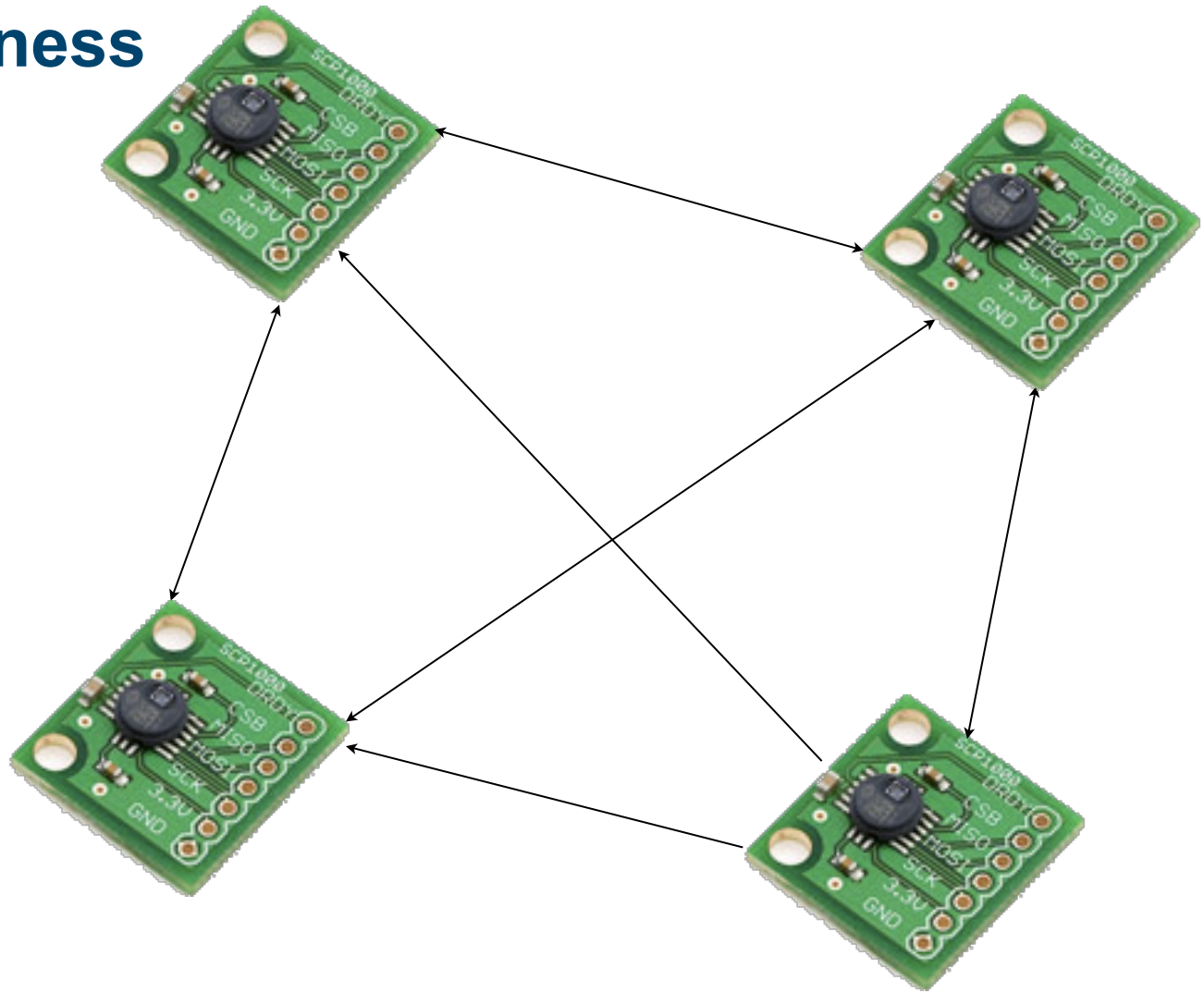
Pseudorandomness?  
(Weak Randomness?)

Get Randomness From System?



# 1. Randomness

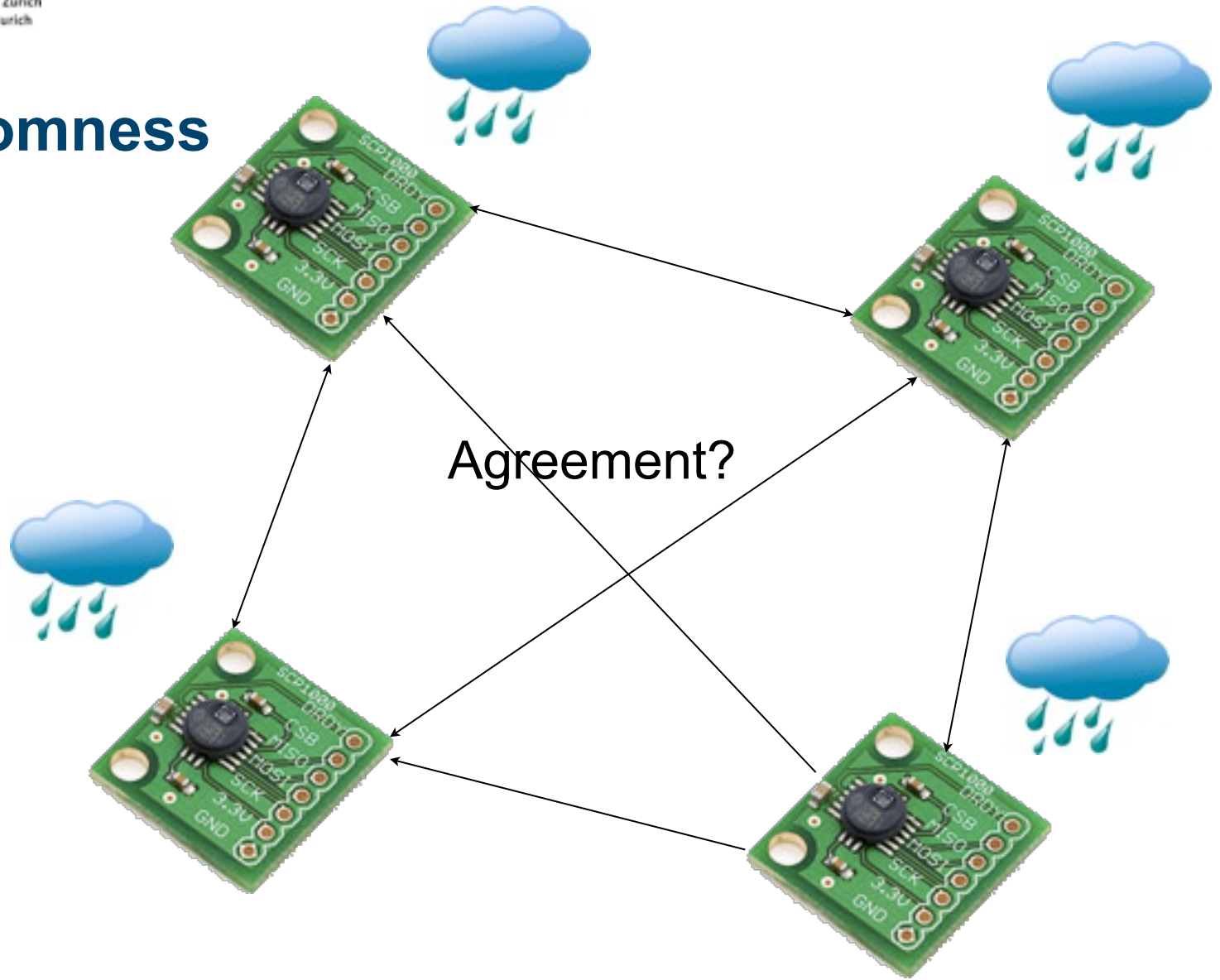
## Setting





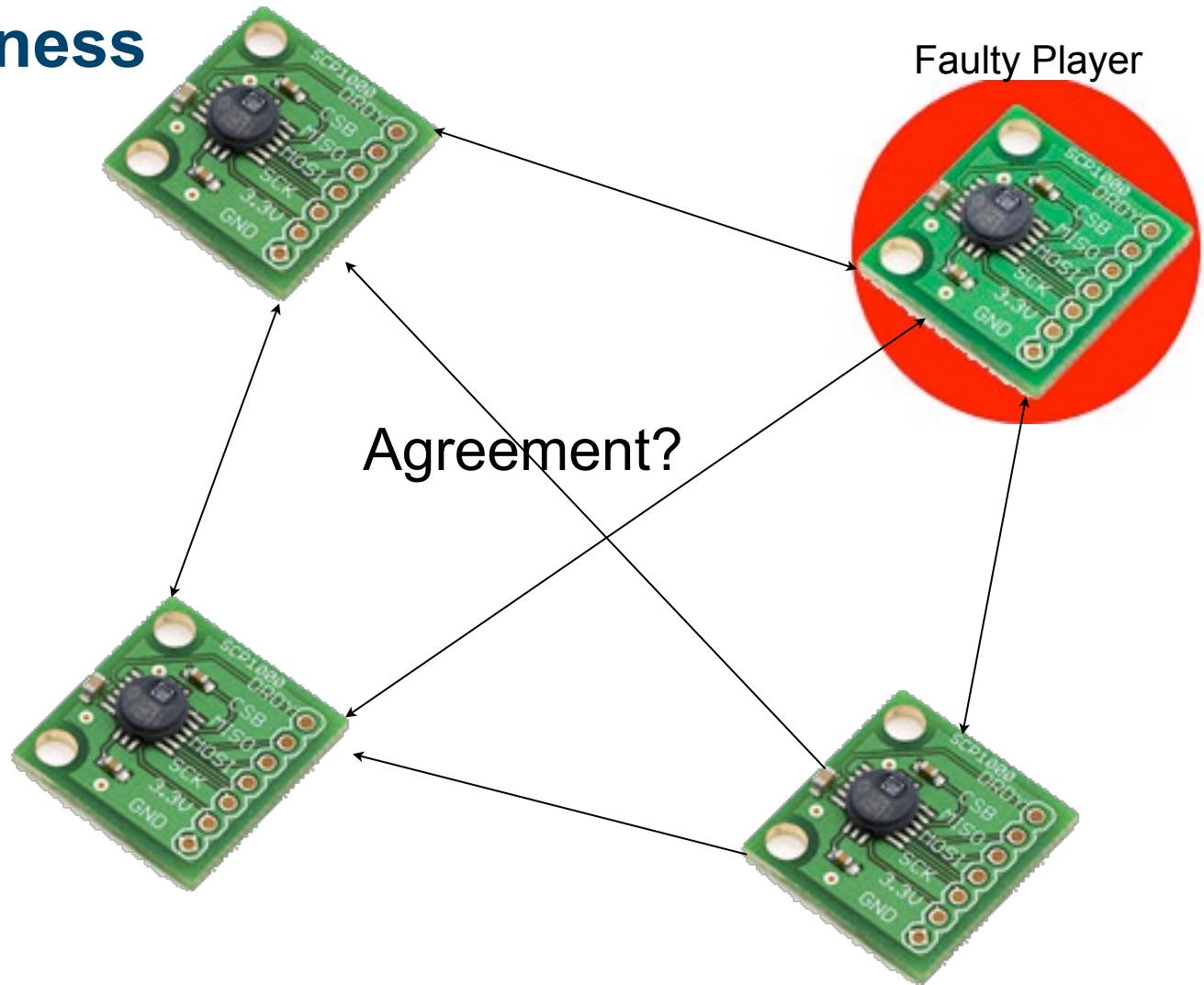
# 1. Randomness

## Setting



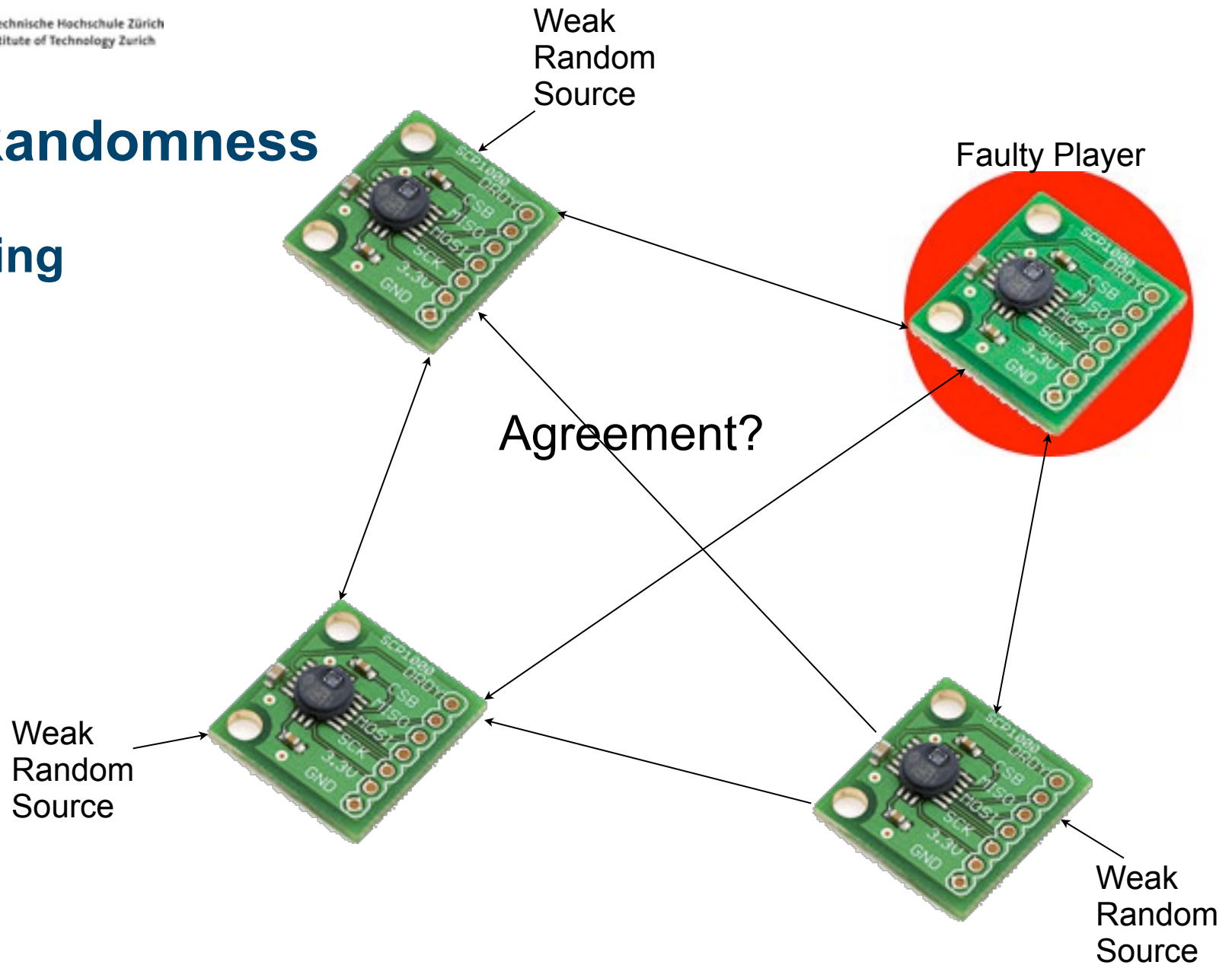
# 1. Randomness

## Setting



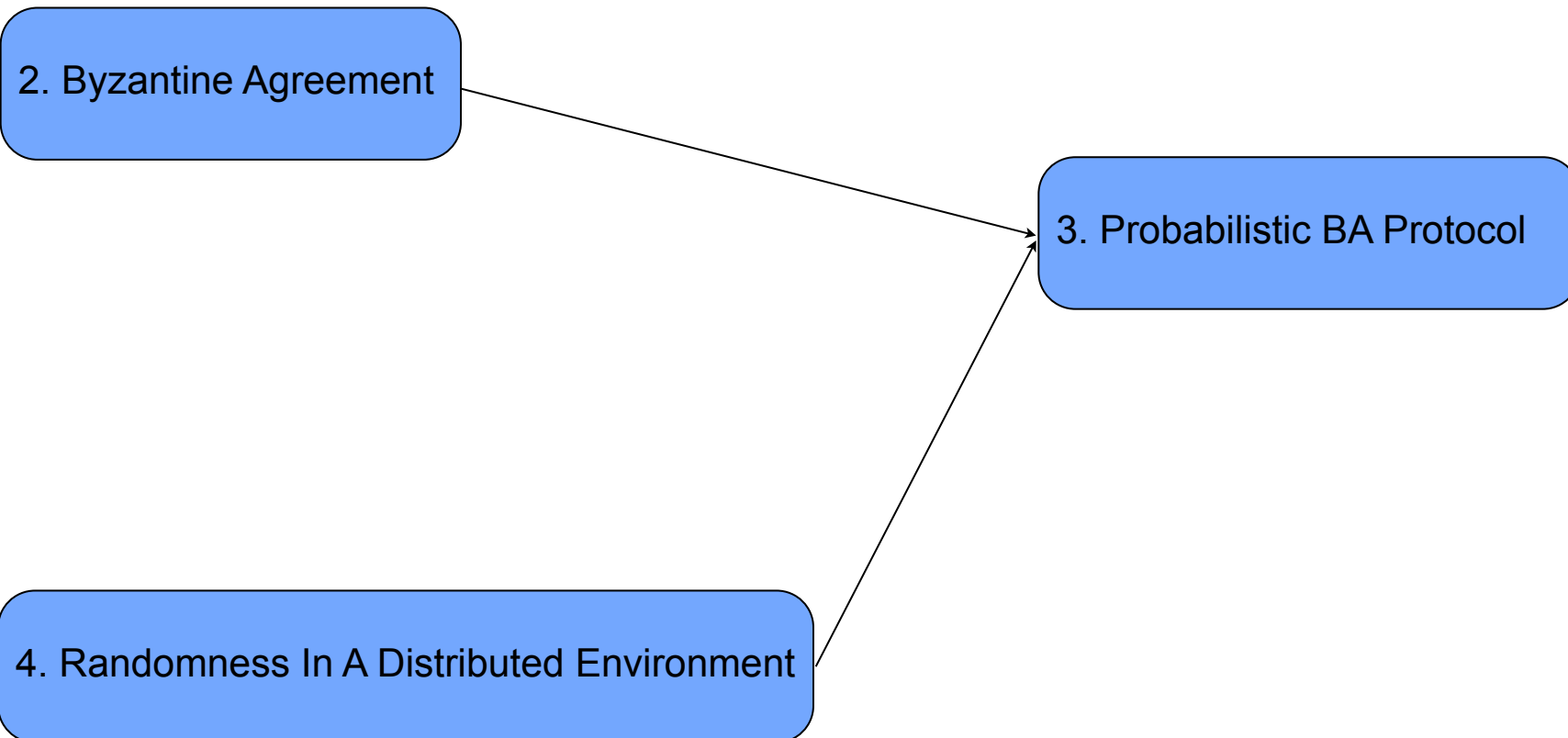
# 1. Randomness

## Setting





# 1. Randomness, Overview



## 2. Byzantine Agreement (single fault case)



## 2. Byzantine Agreement (single fault case)



## 2. Byzantine Agreement (single fault case)

A. The non-faulty generals compute exactly the same vector

B. The element of this vector corresponding to a given non-faulty general is the private value/opinion of this general



## 2. Byzantine Agreement (single fault case)

Works if  $n \geq 3m + 1$

And for  $m+1$  rounds are required.



### 3. Probabilistic Byzantine Agreement Protocols

Deterministic Algorithm	Randomized Algorithm A Simple and Efficient Randomized Byzantine Agreement
$m+1$ rounds	$O(m/\log n)$ rounds

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**Randomized Algorithm Expects Players To Have Real Random Source!**

# 4. Randomness In A Distributed Environment

## Formalizing Our Randomness Model



# 4. Randomness In A Distributed Environment

## Formalizing Our Randomness Model

- Strong Randomness:  $U_m$
- Weak Randomness:  $(k, \delta)$ -weak source
- No Randomness

## 4. Randomness In A Distributed Environment

### Randomness Model

- Each player (sensor) has access to its own weak source that is independent of the sources of all other players
- Is there a way to get real randomness (a string of unbiased and independent random bits) by combining weak random sources?

## 4. Randomness In A Distributed Environment

### Randomness Model

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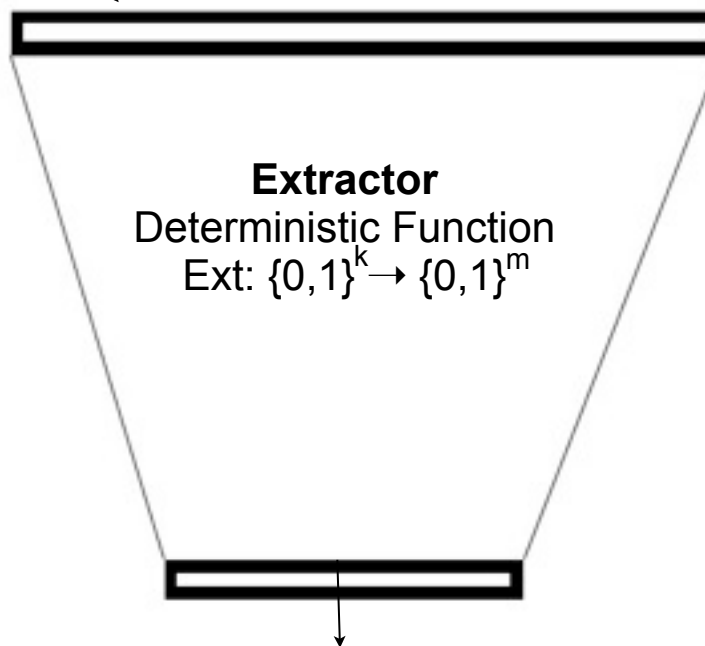
# Extractors!

# 4. Randomness In A Distributed Environment

## Extractors

Weak Random Source

$\{0,1\}^k$   
0100110011011101011



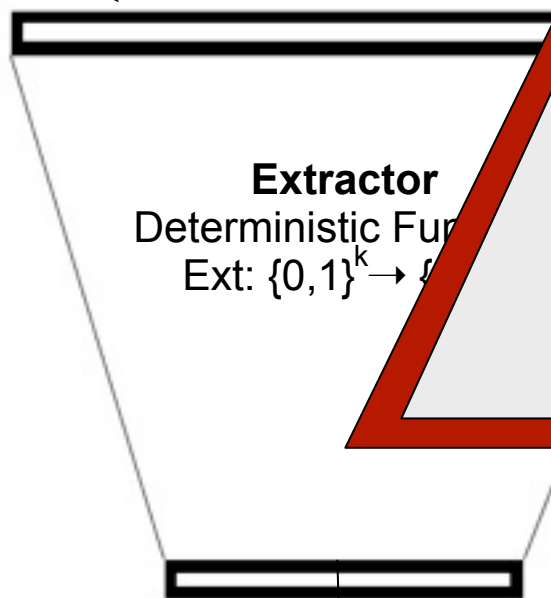
Almost unbiased & independent bits

$\{0,1\}^m$   
01001110

# 4. Randomness In A Distributed Environment

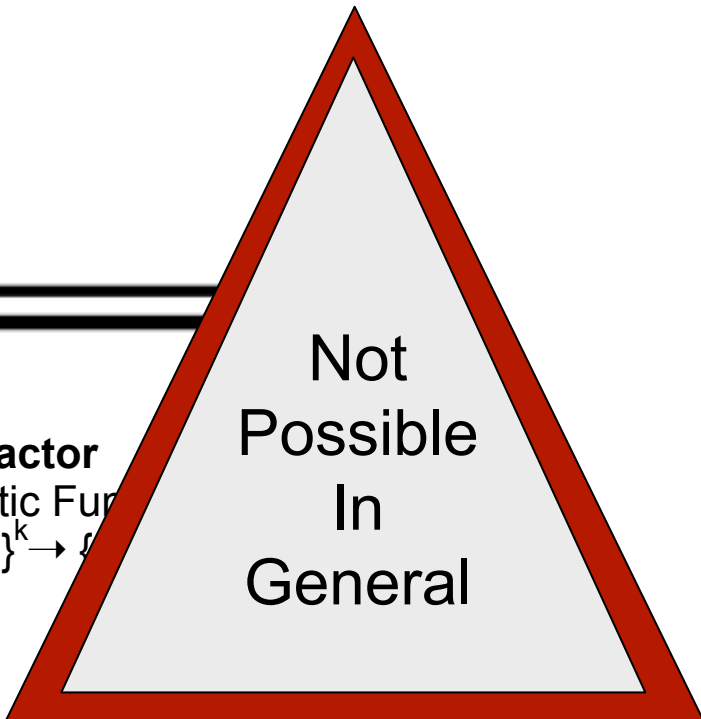
## Extractors

Weak Random Source  
 $\{0,1\}^k$   
0100110011011101011



**Extractor**  
Deterministic Fun  
Ext:  $\{0,1\}^k \rightarrow \{0,1\}^m$

Almost unbiased & independent bits  
 $\{0,1\}^m$   
01001110



Not  
Possible  
In  
General

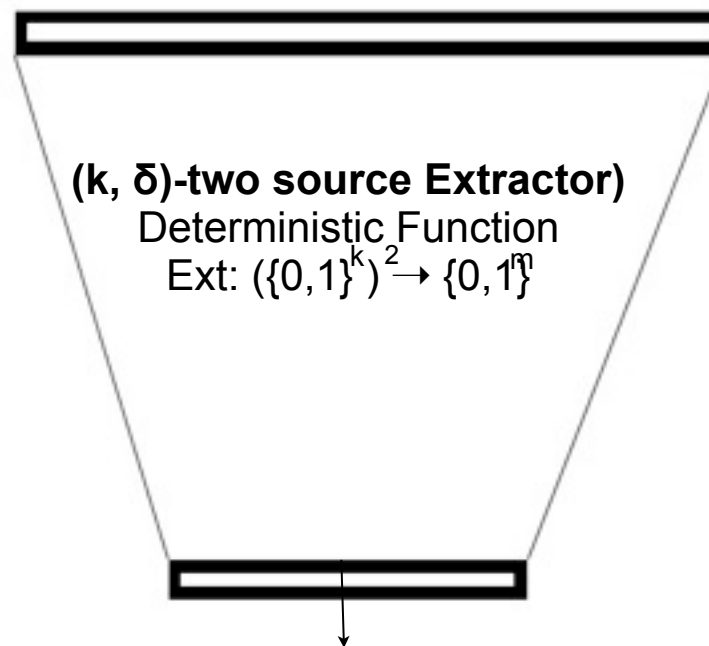
# 4. Randomness In A Distributed Environment

## 2 Source Extractors

Weak Random Source  
0100110011011101011

←independent→

Weak Random Source  
0100111011010011011



**Almost** unbiased & independent bits

$\{0,1\}^m$   
01001110

# 4. Randomness In A Distributed Environment

## A Very Simple Extractor



# 4. Randomness In A Distributed Environment

## A Very Simple Extractor



0

1





# 4. Randomness In A Distributed Environment

## A Very Simple Extractor



0  
0

1  
0



# 4. Randomness In A Distributed Environment

## A Very Simple Extractor



0	1
0	0
1	1



# 4. Randomness In A Distributed Environment

## A Very Simple Extractor



0	1
0	0
1	1
1	0



# 4. Randomness In A Distributed Environment

## A Very Simple Extractor



0	1
0	0
1	1
1	0
0	0



# 4. Randomness In A Distributed Environment

## A Very Simple Extractor



0	1
0	0
1	1
1	0
0	0
1	0



# 4. Randomness In A Distributed Environment

## A Very Simple Extractor



0	1
0	0
1	1
1	0
0	0
1	0
0	1



# 4. Randomness In A Distributed Environment

## A Very Simple Extractor



0	1	0
0	0	
1	1	
1	0	1
0	0	
1	0	1
0	1	0



# 4. Randomness In A Distributed Environment

## A Very Simple Extractor



0	1	0
0	0	
1	1	
1	0	1
0	0	
1	0	1
0	1	0

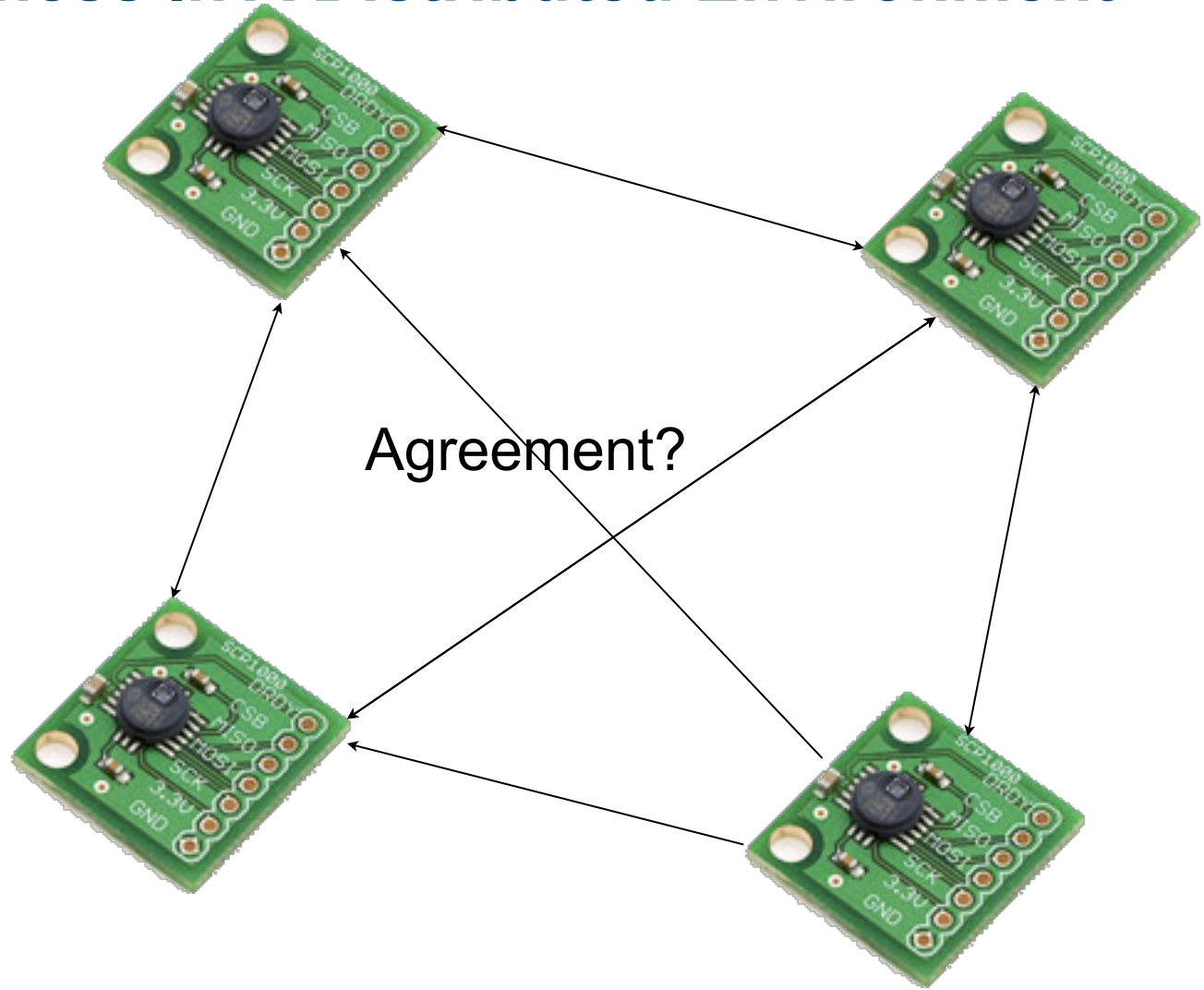


**Not a  $(k, \delta)$ -two source Extractor!  
(do you see why?)**



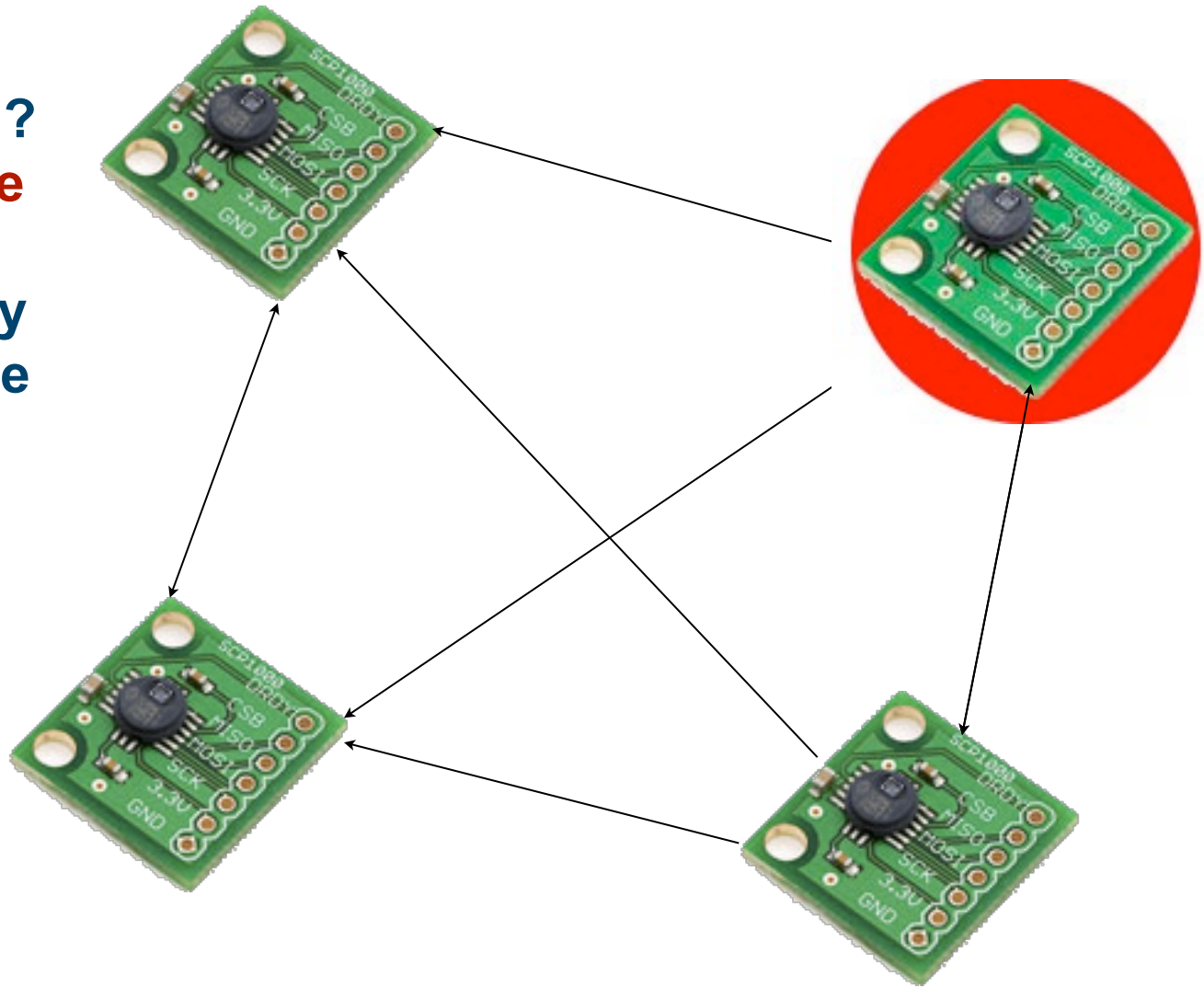
# 4. Randomness In A Distributed Environment

Is this enough?



## 4. Randomness In A Distributed Environment

Is this enough?  
**No, as we have  
faulty players!**  
What if they try  
to “poison” the  
randomness?



# 4. Randomness In A Distributed Environment

## Immune Extractors

- **Multi-source extractors whose output is random even if an arbitrary subset of the input sources don't send a weak random string (e.g. faulty players) but all sources are independent**

# 4. Randomness In A Distributed Environment

## $(\kappa, \tau)$ Immune Extractors, as a picture

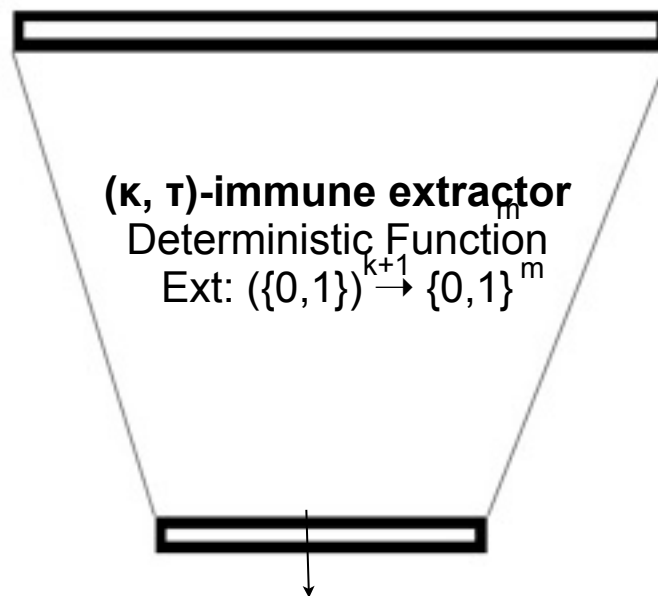
$\kappa + 1$  block sources

$(\kappa, \delta)$  source

$(\kappa, \delta)$  source

$(\kappa, \delta)$  source

$(\kappa, \delta)$  source



Almost unbiased & independent bits

$\{0,1\}^m$   
01001110

## 4. Randomness In A Distributed Environment

### I-Ext: A(t, t-1)-immune extractor

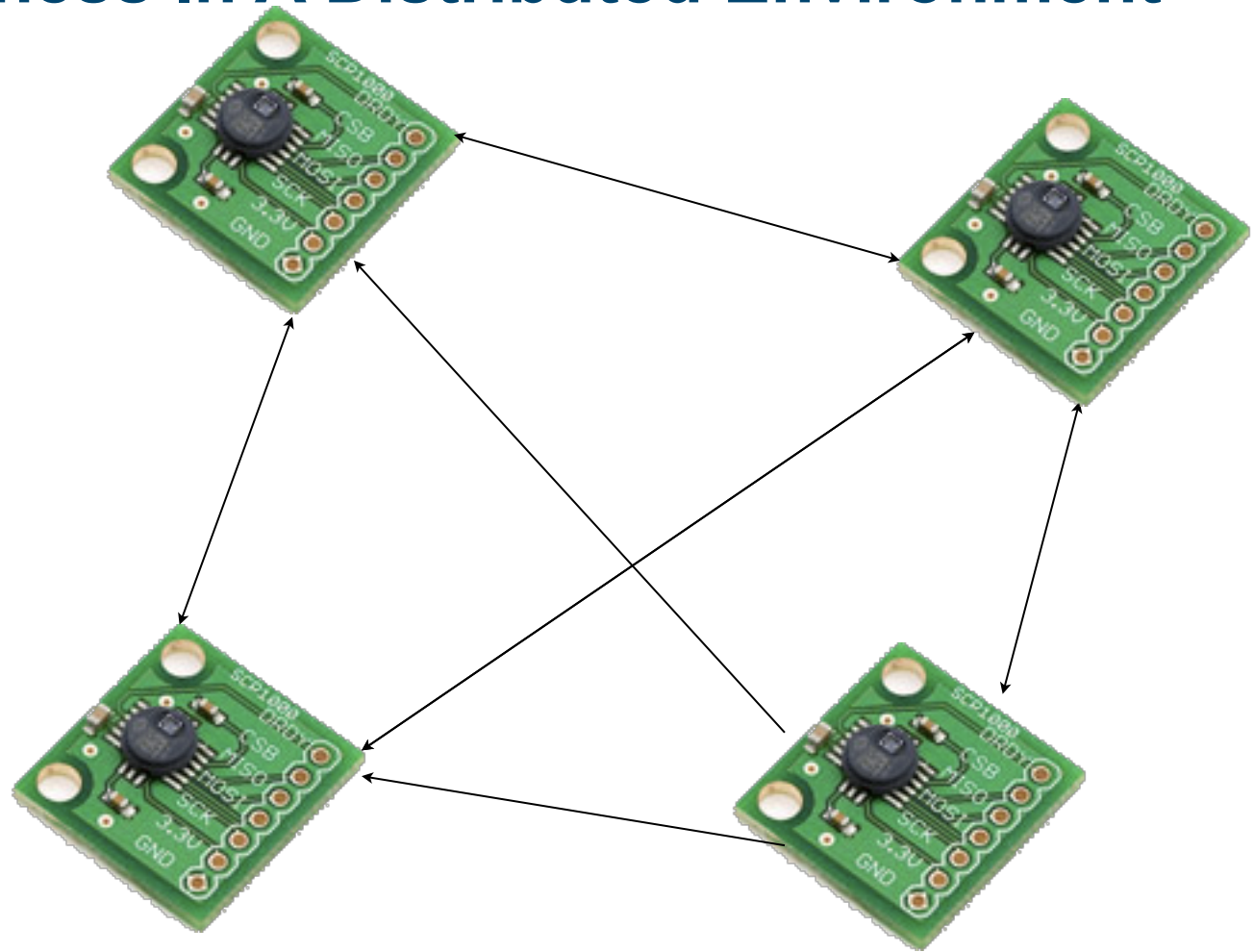
- Let Ext be any  $(k, \delta)$  two source extractor
- Let  $X_1^2, X_1^3, \dots$  denote  $t$  distinct blocks from the source  $X_1$
- Let  $X_2, X_3, \dots$  be one block each from the other  $t$  sources
- $\text{I-Ext}(\{X_1^i\}_{i=2}^{t+1}, X_2, \dots, X_{t+1}) = \bigoplus_{i=2}^{t+1} \text{Ext}(X_1^i, X_i)$

# 4. Randomness In A Distributed Environment

## I-Ext: A (t, t-1)-immune extractor

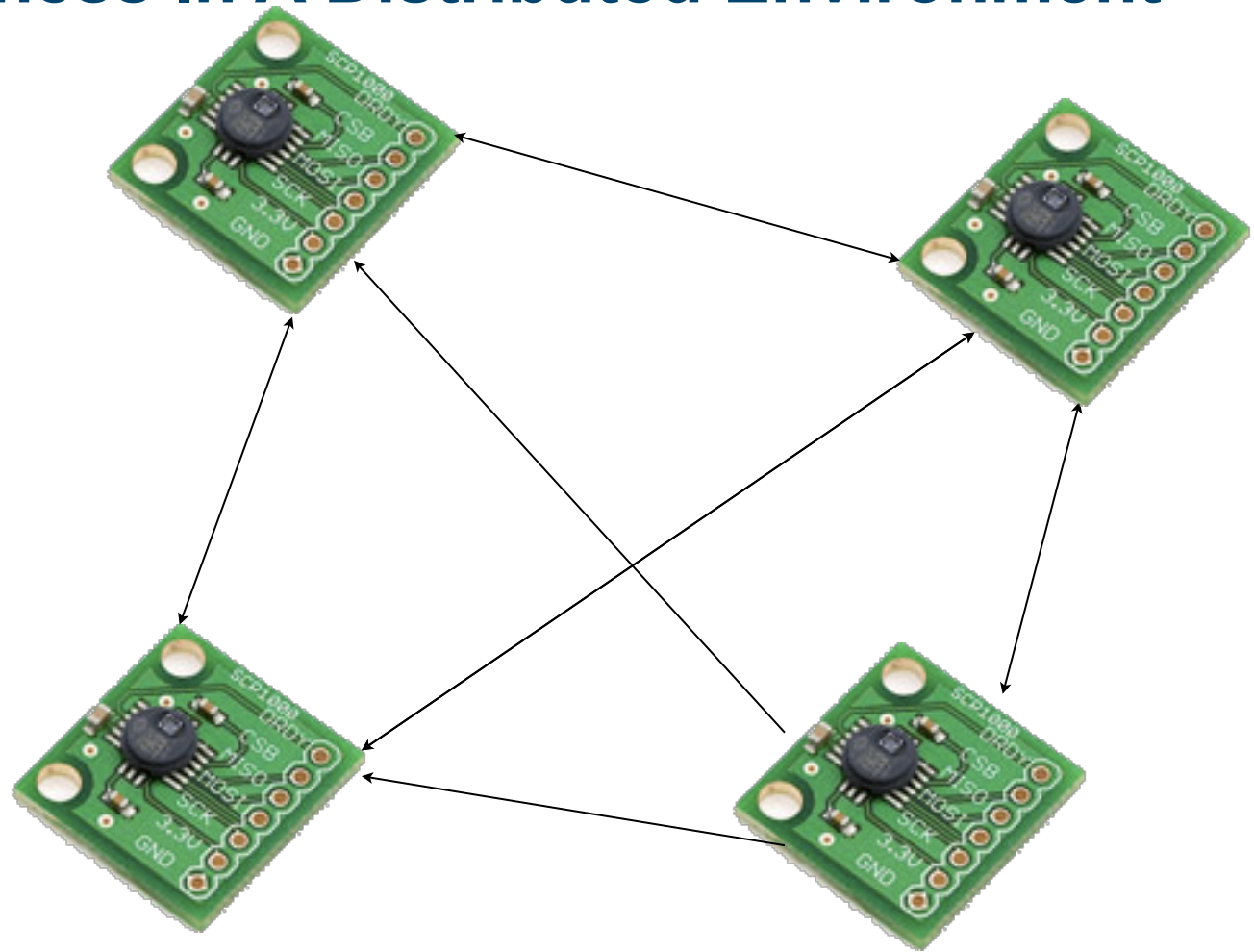
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- **Theorem: I-Ext is a (t, t-1) immune extractor!**

## 4. Randomness In A Distributed Environment



... each player sends each other player a string from its weak random source ...

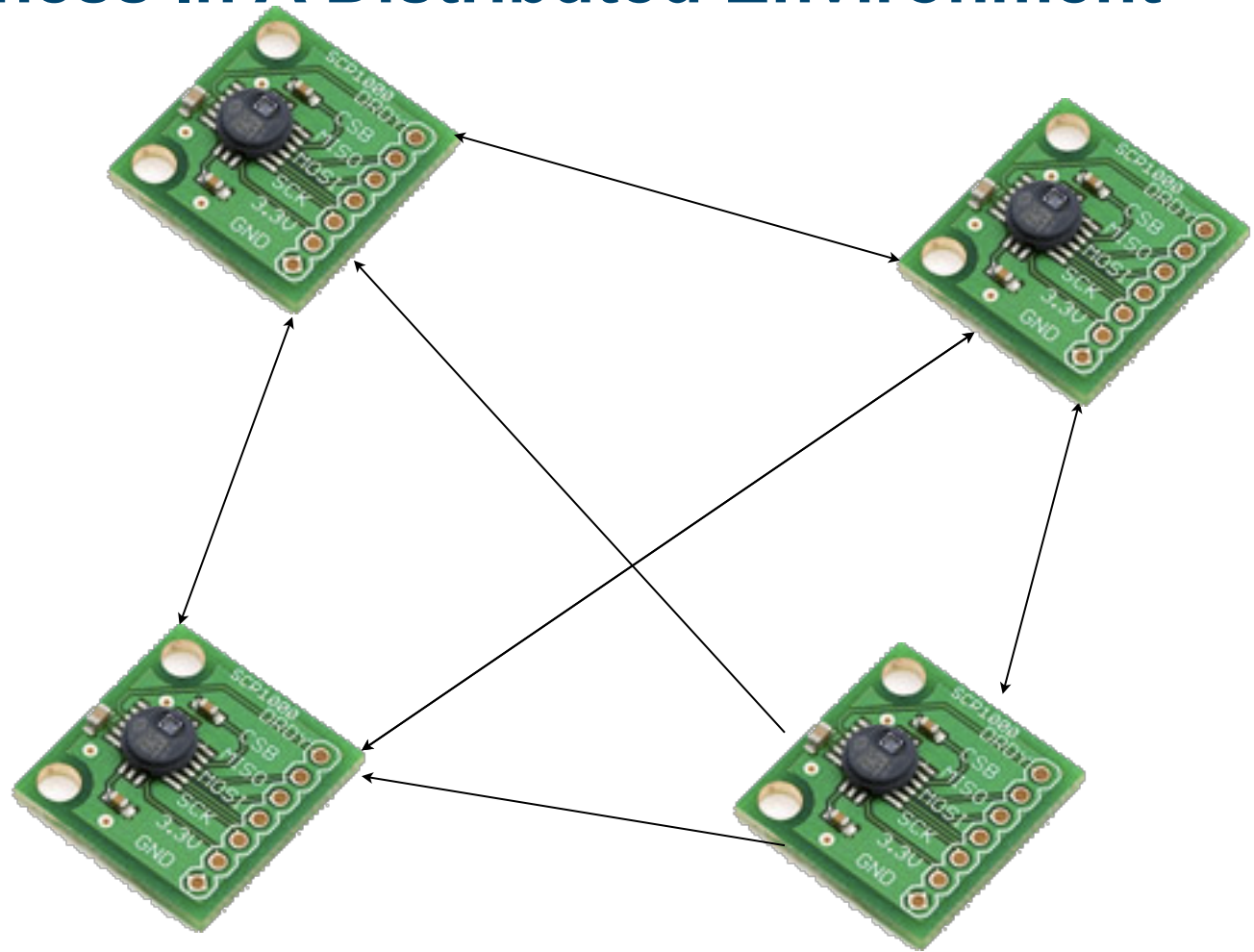
## 4. Randomness In A Distributed Environment



... each player can use I-Ext to generate a string very close to  $U_m$  ..



## 4. Randomness In A Distributed Environment



... every player has an almost random string ...

## 5. Conclusion

The paper mainly showed how it is possible to for each player of a network to extract a almost unbiased, uniform random string by sharing their (mutually independent) random sources, even in presence of faulty or even malicious parties.

