

# Outsourcing computations and security

Jean-Louis Roch

*Grenoble INP-Ensimag, Grenoble-Alpes University, France*

1. Computation with encrypted data : FHE
2. Interactive verification of results
3. Zero-knowledge proofs
  - Interactive zero-knowledge protocols
  - exercise
4. Secure multiparty Computations

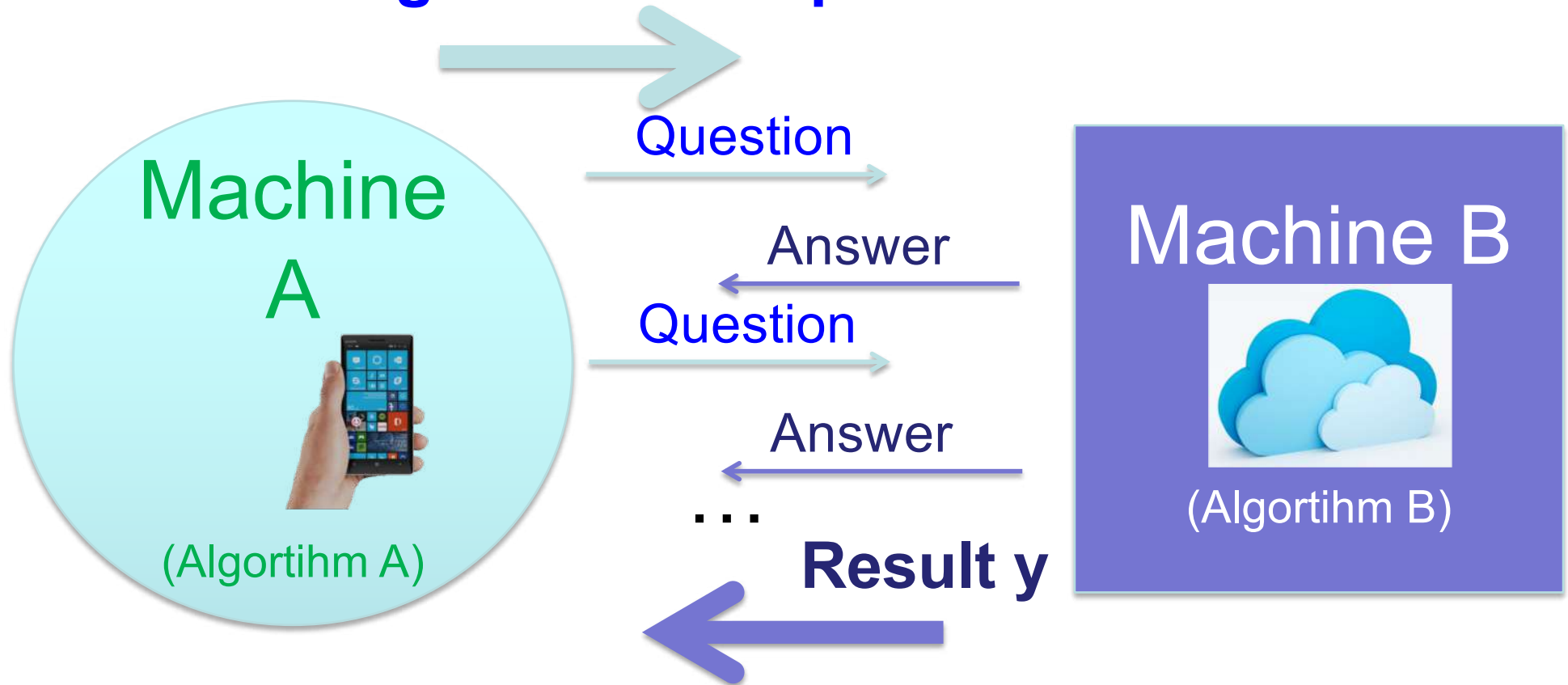
# Distributed, heterogeneous



Various computing abilities and levels of trust

# Outsourcing protocols and security

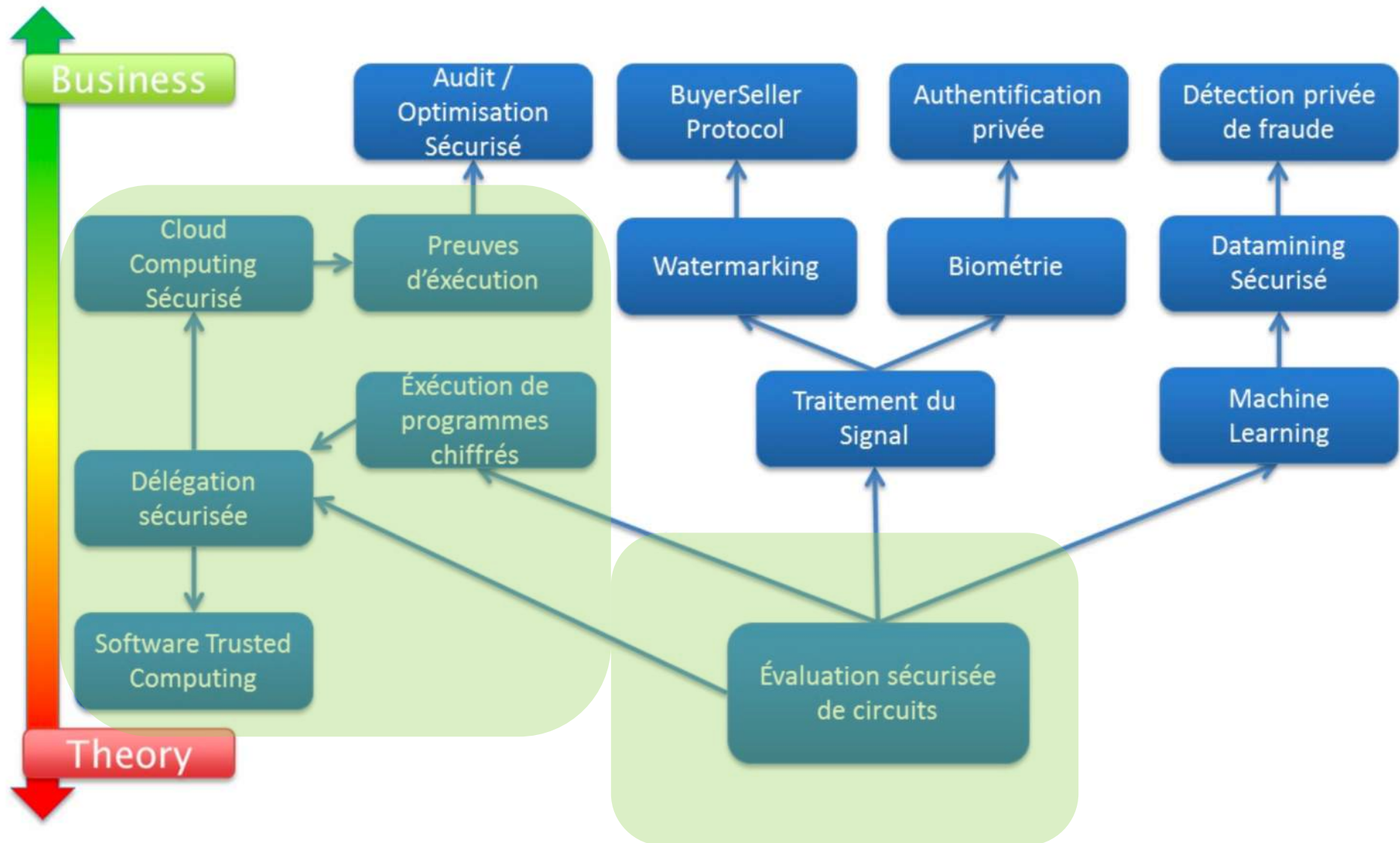
**Program  $f$  with input  $x$**



*Trust in the result ?*

*=> protocols for trustfully delegation of computations*

# Positioning in current trends & market



# Outsourcing computations and security

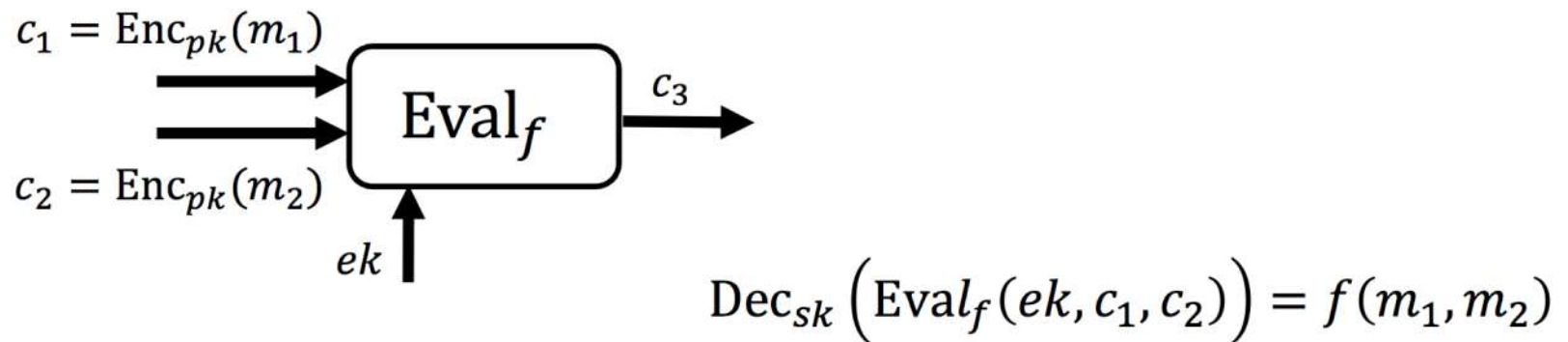
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# Computations with encrypted data

- Outsourcing computation with secret input
  - Computation is performed on encrypted data
  - Based on asymmetric encryption (eg thanks to fully **homomorphic encryption**) [Gentry 2009]



# Homomorphic encryption: El Gamal e-vote

- **Remind El Gamal** (in cyclic group  $G$  with  $g$  a generator):
  - Bob has private key  $b$  and public key  $B=g^b$
  - Alice:  $c=E(m) = (c_1=g^r, c_2=m \cdot B^r)$       Bob:  $D(c)=c_1^{-b} \cdot c_2 = m$
- **El Gamal enables homomorphic addition** (*note Alice encrypts  $g^M$  instead of  $M$* )
  - $C=E(g^M) = (g^r, g^M \cdot B^r)$     (encode  $g^M$  instead of  $M$ )
  - $C'=E(g^{M'}) = (g^{r'}, g^{M'} \cdot B^{r'})$
  - Multiplication of ciphertext in  $G$  matches addition of plaintext (*e.g. integers plaintext*)
 
$$\begin{aligned} C \cdot C' &= (g^r \cdot g^{r'}, g^M \cdot B^r \cdot g^{M'} \cdot B^{r'}) = (g^{r+r'}, g^{M+M'} \cdot B^{r+r'}) \\ &= E(g^{M+M'}) \end{aligned}$$
  - Enables anyone to compute as many additions of ciphertexts as desired
  - **Question 1:** if  $M+M'$  small, how to decrypt  $M+M'$  from  $g^{M+M'}$  without discrete log ?
- **Application: electronic vote by homomorphic addition**
  - Each voter (Alice) sends her encrypted vote  $v$  (0 or 1) to the voting machine (Bob) :
    - $C(0)=(g^r, B^r)$      $C(1)=(g^r, g \cdot B^r)$  : each voter checks her encrypted vote is correctly stored
  - Each one can compute the encrypted score of the vote :  $\Pi_{C \text{ voter}}(C) = (g^{\sum r}, g^{\sum v} \cdot B^{\sum r})$
  - The voting machine knows secret  $b$  : it computes  $g^{\sum v}$  and publishes score  $\sum v$  and  $\sum r$ 
    - **Question 2:** How the voting machine computes  $\sum_{\text{voters}} v$  from  $\Pi_{C \text{ voter}}(C) = (g^{\sum r}, g^{\sum v} \cdot B^{\sum r})$  ?
    - **Question 3 :** How each voter verifies the result  $\sum_{\text{voters}} v$  ?

# Fully Homomorphic Encryption (FHE)

- Does there exist homomorphic boolean encryption ? => YES [Craig 2010]
- **Somewhat Fully Homomorphic Encryption** [Marten van Dijk, Craig Gentry, Shai Halevi, Vinod Vaikuntanathan]
  - Secret  $p$  : a large odd integer (eg thousands of digits)
  - For  $x$  in  $\{0,1\}$  :  $E(x) = pq + 2r + x$   
 With random  $q \sim$  million of digits and  $r \sim$  twenty digits (the **noise**)
  - Knowing  $p$ :  $(E(x) \bmod p) \bmod 2 = (2r+x) \bmod 2 = x$
  - Without knowing  $p$ :  $E(x)$  seems to give no information
- **Fully homomorphic with  $x$  and  $y$  booleans:**
  - $E(x)+E(x')=p.(q+q') + 2(r+r') + x+x' \Rightarrow \bmod p \bmod 2 = x \text{ XOR } x'$
  - $E(x).E(x')=p (pq+q'(2r'+x')+q(2r+x)+q'(2r+x)) + 2(2rr'+rx'+r'x) + x.x' \Rightarrow \bmod p \bmod 2 = x \text{ AND } x'$
  - Beware : AND and XOR operations increase the noise
    - If noise  $r$  larger than  $p$ , decryption is impossible (eg if  $2r = p.u+v$  then  $(E(x) \bmod p) \bmod 2 = (v+x) \bmod 2$ )
    - choice of  $p$  and the  $q$ 's large enough!
- Anyway with operations, the noise increases and may become larger than  $p$   
 Key Gentry's idea: **remote bootstrapping**
  - Refresh the noise by outsourcing «  $\bmod p$  » on the cipher domain  
 homomorphic computation with AND and XOR (so without revealing  $p$ , only its ciphering !)
- Many applications of FHE :
  - example: outsourcing AES enc/decryption !



# Outsourcing and privacy

- Homomorphic scheme enables to outsource encryption with secret key (or signature)
- Homomorphic encryption enables publicly Verifiable computation [Fiore, Gennaro 2012, ... ]
  - Server computes on private data and produces a verifiable digest of the computation
  - Enables some verification of the computation
    - Different from a direct result certification

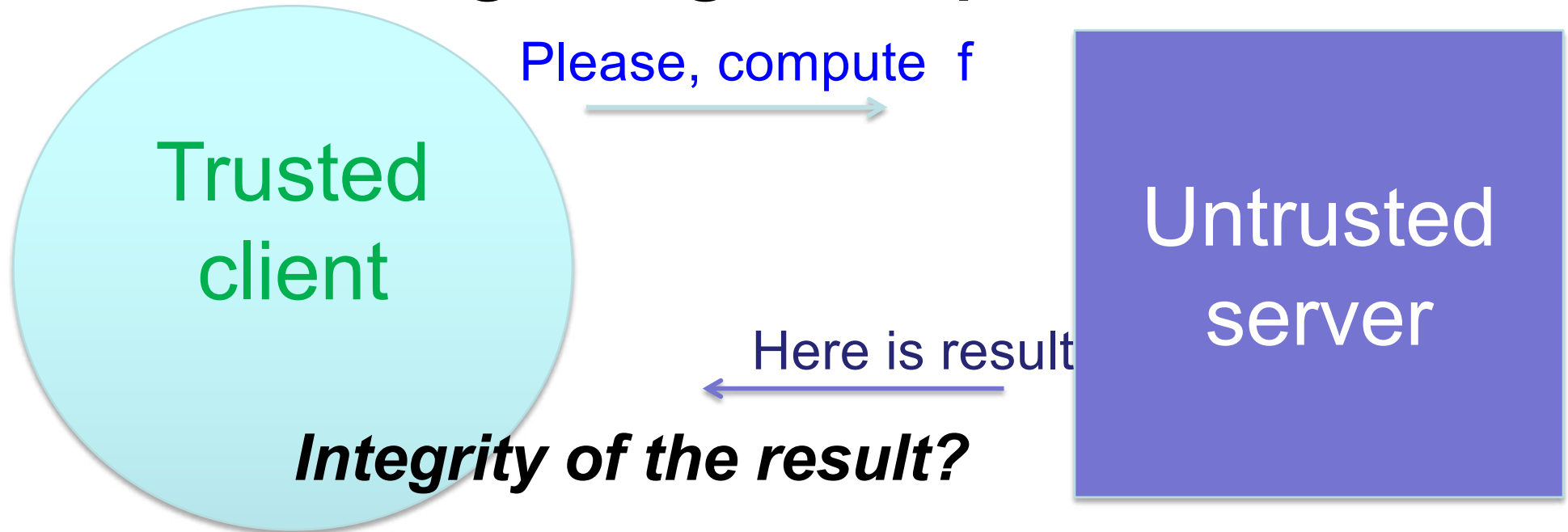
# Outsourcing computations and security

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4. Multiparty computations

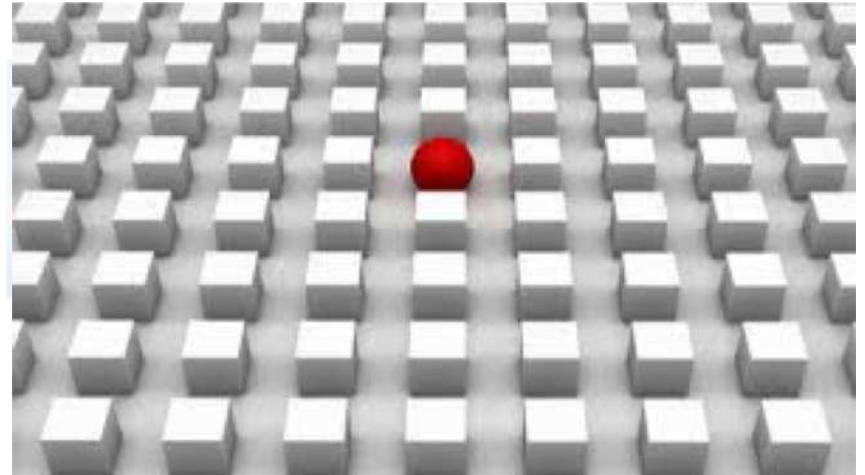
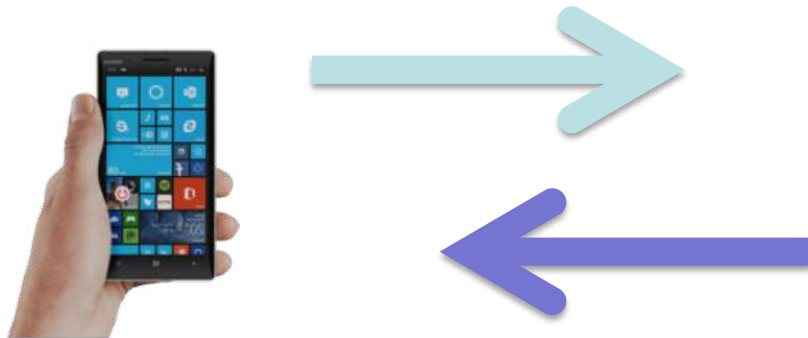
# Delegating computation



- Contexts
  - Co-processor (overclocked...)
  - Supercomputer (soft errors)
  - Cloud computing
  - Volunteer computing

# Attack models

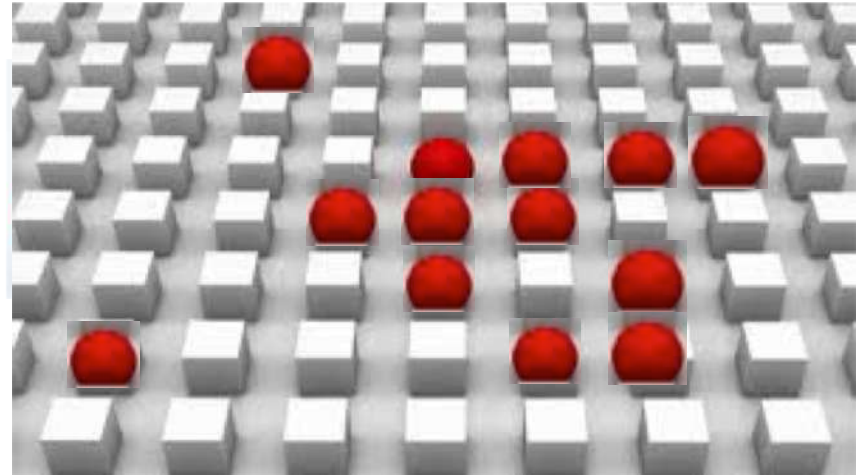
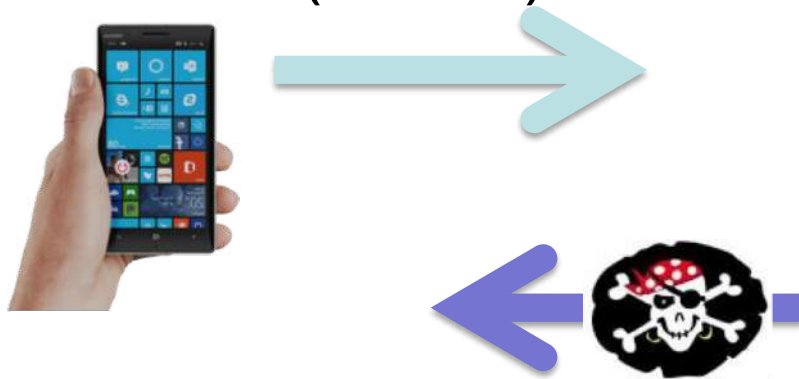
- No attack [current HPC and grid computing platform ]
  - Failure (MTBF)



- **Attack on few isolated resources**
  - Soft errors - corruption of part of the computation

# Attack models

- No attack [current HPC and grid computing platform]
  - Failure (MTBF)

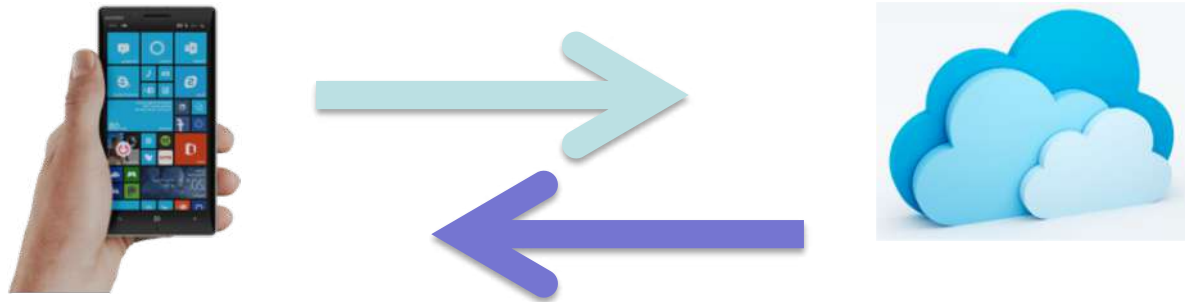


- **Attack on few isolated resources**
  - Soft errors - corruption of part of the computation
- **Massive attacks**

*Countermeasures against such attacks (detect/correct)*

# Verifiable [outsourced] computation

- **Trusted but slow Client** (Verifier, *Victor*) sends a function  $F$  with input  $x$  to the server



- **Fast but untrusted Server** (Prover, *Peggy*) returns  $y = F(x)$  and a proof  $\Pi$  that  $y$  is correct.

**Computing  $\Pi$  should take almost same time than  $F$ .**

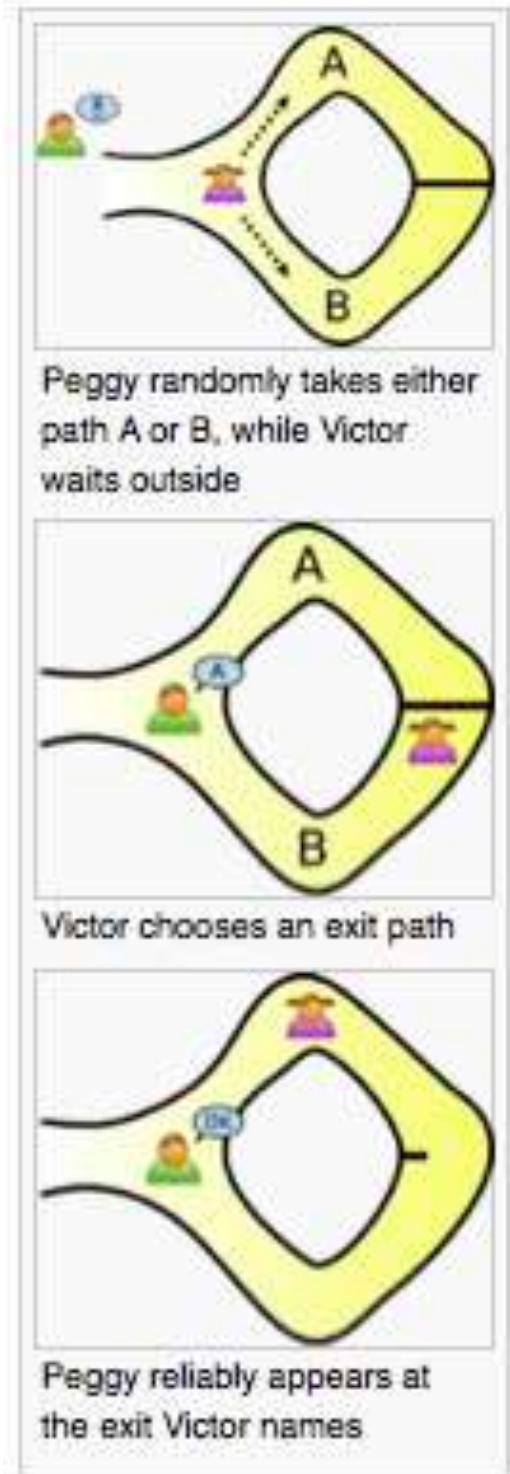
**Verifying  $\Pi$  should take less time than computing  $F$ .**

# Motivating example

- Peggy has developed a nice application that efficiently solves Traveling Salesman Problem
- Victor sends Peggy the location (map) of his clients and pays her for the shortest Hamiltonian circuit
- Can Victor check he really gets the shortest?

# Example [wikipedia]

- A tunnel, closed by a trapdoor rock.
- Ali Baba knows the secret
  - « Iftah Ya Simsim » («Open Sesame»)
  - "Close, Simsim" («Close Sesame»).
- Victor design a protocol that « proves » Ali Baba gets the secret without revealing it
  - Ali Baba (indeed Peggy) is *the Prover*
  - Victor is *the Verifier*
  - Peggy leaks no information (*0-knowledge*)





# Proof and Interactive proof

- Importance of « proof » in crypto: eg. identity proof=authentication
- Two parts in a proof:
  - Prover: knows the proof (-> the secret) [or is intended to know]
  - Verifier: verifies the proof is correct (-> authentication)
- Correctness of a proof system/verifier:
  - **Completeness: *every valid proof* is accepted** by the verifier
  - **Soundness: every invalid proof is rejected** by the verifier
- Interactive proof system
  - Protocol (questions/answers) between the verifier and the prover
  - Verifier: **probabilistic** algorithm, **polynomially bounded**
  - Soundness: every invalid proof is rejected with good probability ( $> 1/2$ )
  - Completeness: every valid proof is accepted with good probability ( $> 1/2$ )

# Decision problem

## Does $x$ belongs to $L$ ?

- Verifier
  - An element  $x$
  - Ask questions to prover to determine : «  $x \in L$  »
  - Gets answer:
    - Completeness: Is convinced that  $x$  in  $L$ , if so
    - Soundness: reject «  $x$  in  $L$  » if not so

# Fundamental theorem

## [Goldreich&al]

- Def: ***IP*** = set of decision problem that admits a randomized polynomial time verification algorithm  
i.e. both size of transcripts and number of operations performed by verifier are polynomial
- ***IP = PSPACE***
  - ***NP*** included in ***IP***.
- Any (PSPACE) computation admits a randomized deterministic polynomial verification algorithm.

# Interactive protocol :Example

- Example: interactive authentication based on quadratic residue
- See exercise (question 3.b)
  - Completeness : Alice, who gets the secret (square root) is accepted
  - But not Soundness : Eve, who doesn't know the secret may cheat
- Fiat-Shamir's protocol (question 3.c)
  - Soundness : Eve, who doesn't know the secret, is rejected.(if we assume  $n$  factorization unknown)

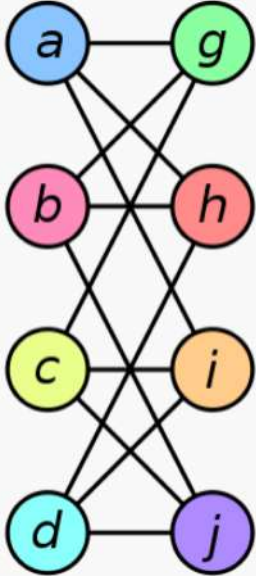
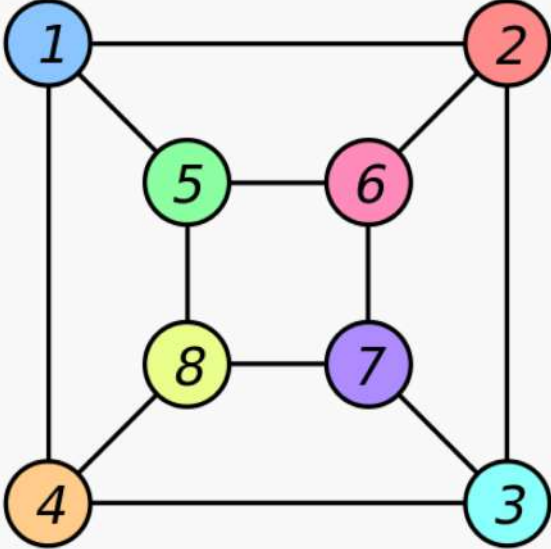
# The power of interaction



**Verifier**  
(Victor)



**Prover**  
(Peggy)

Graph G	Graph H	An isomorphism between G and H
		$f(a) = 1$ $f(b) = 6$ $f(c) = 8$ $f(d) = 3$ $f(g) = 5$ $f(h) = 2$ $f(i) = 4$ $f(j) = 7$

On 2010/10/24, 8 am

- $\in$  NP, but not known to be in NP or in NP-complete or in NP-intermediate
- Does it belongs to co-NP or not ? (Open question)
- but Subgraph isomorphism problem is NP-complete

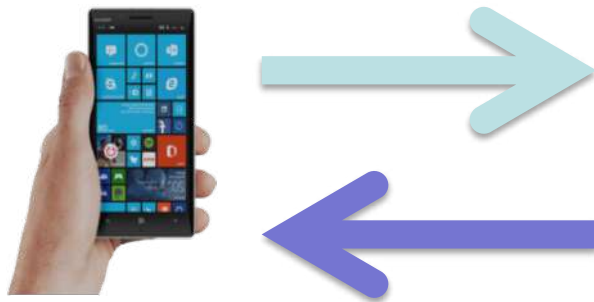
# Example of interactive computation

- Graph isomorphism:
  - Input:  $G=(V,E)$  and  $G'=(V',E')$
  - Output: YES iff  $G == G'$  (i.e. a permutation of  $V \rightarrow V'$  makes  $E=E'$ )
- In NP but not known today to be NP-complete or in P
  - In 2015, Babai proposes a quasi-polynomial algorithm [  $2^{O(\log^k n)}$  ]  
(a bug was claimed on 2017/1/1 and fix on 2017/1/7)
- Not known to be in co-NP
- Assume an NP Oracle for Graph isomorphism  $\Rightarrow$   
then a probabilistic verifier can verify that two graphs are not isomorphic in polynomial time.
  - Protocol and error probability analysis.

# Interactive graph [non]-isomorphism

- Victor

- Toss  $b := \text{rand}\{1,2\}$
- $H := \text{random\_permutation}(E_b)$
- Asks Peggy: to which  $H$  is isomorphic to :  $E_1$  or  $E_2$  ?



***Peggy returns  $y$  and  $\Pi$***

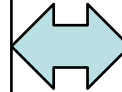
- Victor checks  $\Pi$  and if OK
  - If  $y \neq b$  : Victor has a proof that  $E_1$  is isomorphic to  $E_2$
  - Else  $y = b$  : Victor stated that  $E_1$  is not isomorphic to  $E_2$  with error probability  $\frac{1}{2}$



# Interactive Algorithm Graph Isomorphism

## Verifier

```
AlgoGraphIso( $G_1=(V_1, E_1)$ ,  $G_2=(V_2, E_2)$ ) {  
  If ( $\#V_1 \neq \#V_2$ ) or ( $\#E_1 \neq \#E_2$ )  
    return "NO :  $G_1$  not isomorphic to  $G_2$ ";  
   $n := \#V_1$  ;  
  For ( $i=1 \dots k$ ) {  
     $P := \text{randompermutation}([1, \dots, n])$  ;  
     $b := \text{random}(\{1,2\})$  ;  
     $G' := P(G_b)$  ;  
    ( $i, P_i$ ) := Call OracleWhichIso( $G_1, G_2, G'$ ) ;  
    If ( $G_i \neq P_i(G')$ ) FAILURE("Oracle is not reliable") ;  
    If ( $b \neq i$ ) return "YES :  $G_1$  is isomorphic to  $G_2$ " ;  
  }  
  return "NO :  $G_1$  not isomorphic to  $G_2$ " ;  
}
```



## Prover

```
OracleWhichIso( $G_1, G_2, G'$ ) {  
  // precondition:  $G'$  is isomorphic to  
  //  $G_1$  or  $G_2$  or both.  
  // Output:  $i$  into  $\{1,2\}$  and a permutation  
  //  $P_i$  such that  $G_i = P(G')$   
  ... ;  
  Return ( $i, P_i$ ) ;  
}
```

**Theorem:** Assuming OracleWhichIso of polynomial time,  
AlgoGraphIso( $G_1, G_2$ ) proves in polynomial time  $k \cdot n^{O(1)}$  that :

- either  $G_1$  is isomorphic to  $G_2$  (no error)
- or  $G_1$  is not isomorphic with error probability  $\leq 2^{-k}$ .

Thus, it is a MonteCarlo (randomized) algorithm for proving GRAPH ISOMORPHISM

# Analysis of error probability

<i>Truth:</i> $G_1 = G_2 ??$	<i>Prob( Output of</i> <i>AlgoGraphIso(<math>G_1, G_2</math>)</i>	<i>“YES : <math>G_1</math> is</i> <i>isomorphic to</i> <i><math>G_2</math>”</i>	<i>“NO: <math>G_1</math> not</i> <i>isomorphic to <math>G_2</math>”</i>
Case $G_1 = G_2$ (completeness)		Prob = $1 - 2^{-k}$	Prob = $2^{-k}$
No: Case $G_1 \neq G_2$ (soundness)		Impossible (Prob = 0)	Always (Prob = 1)

-When the algorithm output **YES :  $G_1$  is isomorphic to  $G_2$**  then  $G_1 = G_2$   
 $\Rightarrow$  no error on this output.

-When the algorithm output **“NO:  $G_1$  not isomorphic to  $G_2$ ”** then we may  
 have an error (iff  $G_1 = G_2$ ), but with a probability  $\leq 2^{-k}$

**One-sided error  $\Rightarrow$  Monte Carlo algorithm for Graph-Isomorphism**

# Efficient verifiable computing by spot checking

- Check polynomial equality by random evaluation [Schwartz-Zippel]
  - Choose  $r_1, \dots, r_n$  at random in a subset  $S$  of a field
  - If  $Q(r_1, \dots, r_n) = 0$  then  $Q = 0$  with error probability  $\leq \deg(Q) / \#S$
- Example: *Verifying matrix multiplication* (Friedval's algorithm)
  - To check  $C = A.B$ , choose a random vector  $r$  and verify  $C \cdot r = A \cdot (B \cdot r)$

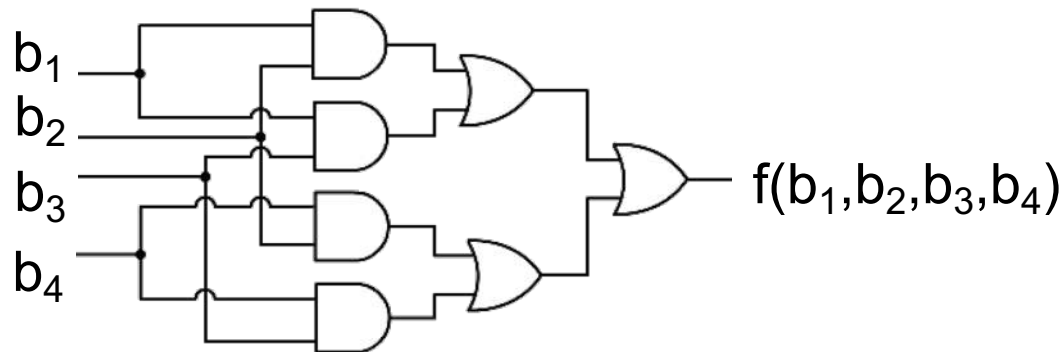
Cost : linear in  $\text{size}(A) + \text{size}(B) + \text{size}(C)$

# Interactive linear algebra

- Most dense linear algebra reduces to Matrix multiplication
  - Locally compute the (recursive) scheme in  $O(n^2)$  while outsourcing all Matrix Multiplications
  - [Algorithm-Based Secure and Fault Tolerant Outsourcing of Matrix Computations, A Kumar, JL Roch, HAL 2013]
- Alternatively provide efficient certificates for sparse linear algebra
  - [Interactive certificates for linear algebra, JD Dumas, E Kaltofen, ISSAC 2014]

# Verifying general circuits

- Inputs :  $b_1 \dots b_n$       Outputs :  $y_1 \dots y_m$
- How to verify  $y_1 \dots y_m = f(b_1 \dots b_n)$



# The power of interaction

- Theorem :  $IP = PSPACE$
- Any problem in PSPACE has a polynomial verifier
  - TQBF (quantified Boolean formula problem )
- A polynomial interactive scheme for #SAT

$P, NP, \dots, IP = PSPACE$

# Complexity classes

Decision problems (1 output bit: YES/ NO)

## ***Deterministic polynomial time:***

- P : both Yes/No sides
- NP : certification for the Yes side
- co-NP: certification for the No side

## ***Randomized polynomial time:***

- BPP: Atlantic City:  $\text{prob}(\text{error}) < 1/2$
- RPP: Monte Carlo:  $\text{prob}(\text{error YES side})=0$  ;  $\text{prob}(\text{error NO side}) < 1/2$
- ZPP: Las Vegas:  $\text{prob}(\text{failure}) < 1/2$  but  $\text{prob}(\text{error})=0$

## ***IP Interactive proof***

- Verifier: randomized polynomial time
- Prover: interactive (dynamic), unbound power
  - $F(x) = \text{YES} \Rightarrow$  it exists a correct prover  $\Pi$  such that  $\text{Prob}[\text{Verifier}(\Pi, x) \text{ accepts}] = 1$ ;
  - $F(x) = \text{NO} \Rightarrow$  for all prover  $\Pi$ :  $\text{Prob}[\text{Verifier}(\Pi, x) \text{ accepts}] < 1/2$ .
- Theorem:  $\text{IP} = \text{PSPACE}$  (interaction with randomized algorithms helps!)

## ***PCP: Probabilistic Checkable Proofs (static proof)***

- $\text{PCP}(r, q)$  : the verifier uses random bits and reads  $q$  bits of the proof only.
- Theorem:  $\text{NP} = \text{PCP}(\log n, O(1))$



# #3-SAT in IP

- Arithmetization in  $F_2$ : each clause  $c$  has a poly.  $Q(c)$ 
  - $Q(\text{not}(x)) = 1-x$                        $Q(x \text{ and } y) = x.y$
  - $Q(x \text{ or not}(y) \text{ or } z) = Q(\text{not}(\text{not}(x) \text{ and } y \text{ and not}(z))) = 1 - ((1-x).y.(1-z))$
- Let  $F = c_1 \text{ and } \dots \text{ and } c_m$  a 3-SAT CNF formula, and  
 $g(X_1, \dots, X_n) = Q(c_1).Q(c_2). \dots .Q(c_m)$  :  $\deg(g) \leq 3m$   
Then  $\#F = \sum_{b_1=0,1} \dots \sum_{b_n=0,1} g(b_1, \dots, b_n)$
- Since  $\#F \leq 2^n$ , for  $p > 2^n$ ,  $(\#F=K)$  is equivalent to  $(\#F=K \bmod p)$ 
  - To limit to a polynomial number of operations, computation is performed mod a prime  $p$  in  $2^n \dots 2^{n+1}$  (provided by prover and checked by verifier)
- Let  $h_n(X_n) = \sum_{b_1=0,1} \dots \sum_{b_{n-1}=0,1} g(b_1, b_2, \dots, b_{n-1}, X_n)$ :  
 $h_n$  is an univariate polynomial (in  $X_n$ ) of degree  $\leq m$

# #3-SAT: interactive polynomial proof

## Verifier

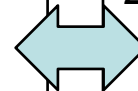
**input:**  $F(X_1, \dots, X_n) = (c_1 \text{ and } \dots \text{ and } c_m)$   
 $K$  an integer; let  $g(x) = \prod_{i=1,n} \text{Pol}(c_i)$   
 Accepts iff convinced that  $\#F = K$ .  
 Preliminar receive  $p$ , check  $p$  is prime in  $\{2^n, 2^{2n}\}$   
 Compute  $g(X_1, \dots, X_n) = \prod_{i=1,n} \text{Pol}(c_i)$   $\deg(g) \leq 3m$   
 Check  $K = \sum_{X_1=0,1} \dots \sum_{X_n=0,1} g(X_1, \dots, X_n) [p]$  :

1. If  $n=1$ , if  $(g(0)+g(1) = K)$  accept ; else reject.  
 If  $n \geq 2$ , ask  $h_n(X)$  to  $P$ .
3. Receive  $s(X)$  of degree  $\leq m$ .  
 Compute  $v = s(0) + s(1)$ ; if  $(v \neq K)$  reject.  
 Else choose  $r = \text{random}(0, \dots, p-1)$ ; let  $K_n = s(r)$   
 and use the same protocol to check  
 $K_n = \sum_{X_1=0,1} \dots \sum_{X_{n-1}=0,1} g(X_1, \dots, X_{n-1}, r) [p]$

## Prover

Preliminar: sends  $p$  prime in  $\{2^n, 2^{2n}\}$

2. Send  $s(X)$  ; [note that if  $P$  is not cheating,  $s(X) = h_n(X)$  ]

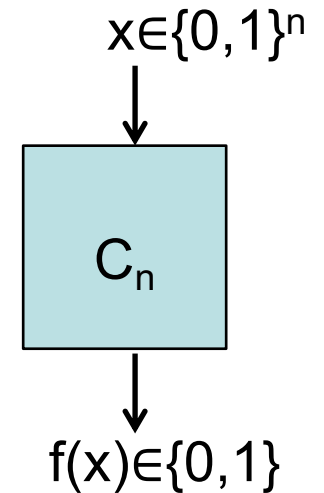
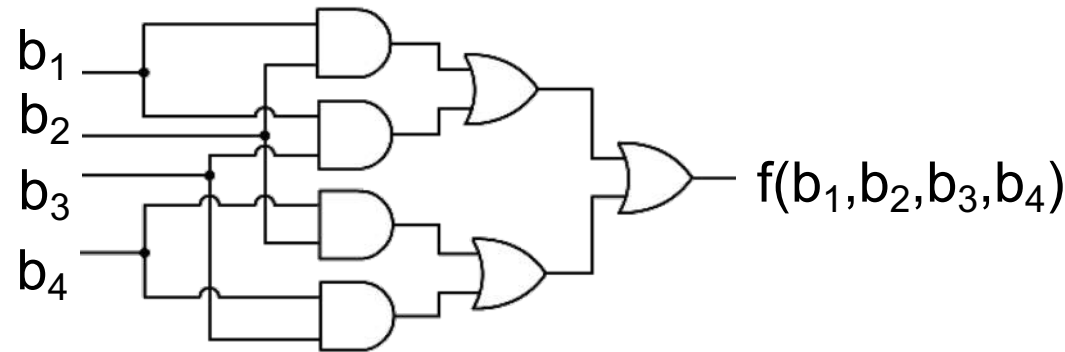


**Theorem:** This is a sound and complete, polynomial time randomized interactive proof of #3-SAT.

Moreover,  $\text{prob}(V \text{ rejects} \mid K \neq \#F) \geq (1-m/p)^n$  ,  
 also  $\text{prob}(\text{error}) \leq 1 - (1-m/p)^n \leq mn2^{-n}$  .

# A key tool: the **sum-check** protocol

- **Input** : a (boolean) circuit  $C_n$  of depth  $\delta$  that implements a function  $f$  with  $n$  bits in input :



- **Output** :  $S_n = \sum_{b_1=0,1} \dots \sum_{b_n=0,1} f(b_1, \dots, b_n)$
- Let  $d=2^\delta$  : #usefull gates  $\leq d$ .  
Theorem: The verifier *interactively* computes  $S_n$  in polynomial time  $(n+d)^{O(1)}$ . (if  $\delta=O(\log n)$ , polynomial in  $n$ )
- Application: number of elements that verify a predicate (#SAT)

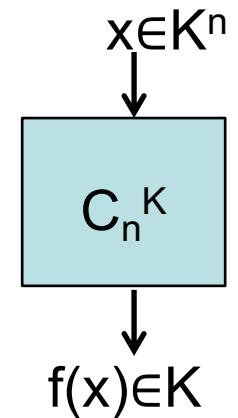
# Key 1: Arithmetization

- Transform the boolean circuit  $C_n$  in an arithmetic circuit  $C_n^2$  in any field  $K$  (eg mod  $p$ ) :

- $x$  and  $y = x \cdot_K y$      $\text{not}(x) = 1 - x$
- $x$  or  $y = \text{not} ( \text{not}(x) \text{ and } \text{not}(y) ) = 1 -_K (1 -_K x) \cdot_K (1 -_K y)$

- Transform the circuit  $C_n^2$  in a circuit  $C_n^K$  with input in a (large) field  $K$ .

- Gates are  $+$  and  $\cdot$  in  $K$
- When inputs are 0 or 1, the output is the same than  $C_n$



- Now, the circuit can be seen as a polynomial in  $n$  variables (the input) with degree  $d$ 
  - For  $m = \log \#K$ , the circuit can be evaluated in time  $(nm)^{O(1)}$ , polynomial for any [random] input in  $K^n$ .

- Key 2: induction on the number of sum**

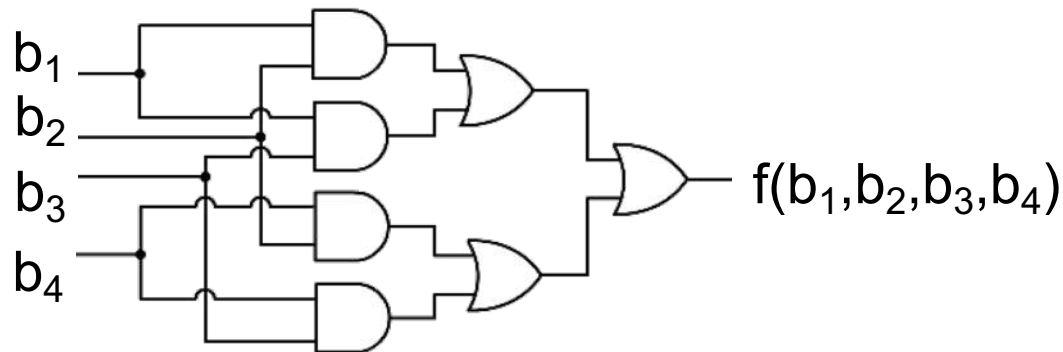
- Each sub-sum is verified with Schwartz-Zippel

# Interactive verification of #3-SAT

- Let:  $\Phi = (c_1 \text{ and } \dots \text{ and } c_m)$  be a 3-SAT CNF formula
- Arithmetization of  $\Phi$  gives  $g(X_1, \dots, X_n) = Q(c_1).Q(c_2) \dots Q(c_m)$
- $\text{Deg}(g) \leq 3m$  (small)  
Polynomial-size circuit to evaluate  $g$  at any  $(b_1, \dots, b_n)$
- To prove  $\#\text{SAT}(\Phi)=K$  reduces to a sequence of sum-check
$$\sum_{b_1=0,1} \dots \sum_{b_n=0,1} g(b_1, \dots, b_n)$$
  - computation in  $F_p$  with  $p$  prime  $> 2^n$

# Verifying general circuits

- Inputs :  $b_1 \dots b_n$       Outputs :  $y_1 \dots y_m$
- How to verify  $y_1 \dots y_m = f(b_1 \dots b_n)$



# Outsourcing general circuits

- Circuits  $C$  with  $n$  inputs and outputs,
  - Work  $W$ , depth  $D$
  - Each level is of degree 1 (multilinear extension)
- Computation is valid iff all levels are corrects
  - Verified by a sum-check at each level
- $\text{Cost} = (N + D) \log^{O(1)} (N + W)$
- Optimization when the computation resumes to a reduction of independent parallel computations

# Illustration on Matrix Multiplication

- Let  $A$  and  $B$  matrices  $(n,n)$  in  $K$  with  $m = \log_2 n$
- $A$  is a (boolean) function  $\{0,1\}^m \times \{0,1\}^m \rightarrow K$  :  
$$A(i_1, \dots, i_m, j_1, \dots, j_m) = A(i, j)$$
- Let  $g_A$  be the polynomial multilinear extension of  $A$
- The  $g_C$  verifies  
$$g_C(i_1, \dots, i_m, j_1, \dots, j_m) = \sum_{k=0..n} g_A(i_1, \dots, i_m, k_1, \dots, k_m) \cdot g_B(k_1, \dots, k_m, j_1, \dots, j_m)$$
- With the sum-check protocol, this sum of  $n$  elements is verified in  $O(\log n)$
- Generalizes to parallel computations with logarithmic depth (NC1)



# Practical efficiency ?

- Further improvements [Thaler]
  - Sum of products only
  - Same circuit for any coefficient

time algorithm for verification:

Problem Size	Naïve MatMult Time	Additional <b>P</b> time	<b>V</b> Time	Rounds	Protocol Comm
1024 x 1024	2.17 s	0.03 s	0.67 s	11	264 bytes
2048 x 2048	18.23 s	0.13 s	2.89 s	12	288 bytes

- Yet far from Fiedvald's verification

# What have we learned ?

- Interactive proof : generalization of a mathematical proof in which a prover interacts with a polynomial-time probabilistic verifier:
  - Completeness and soundness
- Input:  $x$ , proof of property  $L(x)$   
Correct proof:  $x$  is accepted iff  $L(x)$  is true.
  - Completeness : any  $x: L(x)=\text{true}$  is accepted (with  $\text{prob} \geq 2/3$ ).
  - Soundness : any  $y: L(y)=\text{false}$  is rejected (with  $\text{prob} \geq 2/3$ ).
- Powerful interactive proof w.r.t. « static » proof
  - $\text{IP} = \text{PSPACE}$

# Conclusion on outsourcing

- Verifying delegated computation
  - Interaction between models provides power
  - Enables the provable use of untrusted platforms
    - Overclocked processors, algorithms with faults, quantum computing, ...
  - Fully Homomorphic Encryption (powerful but yet expensive)
  - Current research to improve FHE efficiency
- On going research - Applications
  - Cloud computing. (web services)
  - Outsourced fault-tolerant computation
  - Secure remote storage (privacy)
  - Secure control-command for critical infrastructure (SCADA)
  - A promising market (eg digital doctor)



<https://www.youtube.com/watch?v=1Mca4d00OLQ>

# Outsourcing computations and security

Jean-Louis Roch

*Grenoble INP-Ensimag, Grenoble-Alpes University, France*

1. Computation with encrypted data : FHE
2. Interactive verification of results
- 3. Zero-knowledge proofs**
  - Interactive zero-knowledge protocols
  - exercise
4. Secure multiparty computations

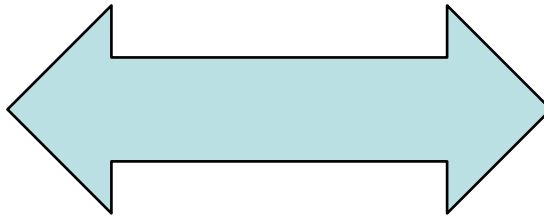
# Interactive proof and zero knowledge protocols

- Zero-knowledge: definition
- Probabilistic complexity classes and Interactive proofs
  - Graph isomorphism and PCP
- Some zero knowledge protocols:
  - Feige-Fiat-Shamir authentication protocol
  - Extension to signature
  - Guillou-Quisquater authentication and signature
- Computational Complexity: A Modern Approach. Sanjeev Arora and Boaz Barak  
<http://www.cs.princeton.edu/theory/complexity/>
- Handbook of Applied Cryptography [Menezes, van Oorschot, Vanstone]
- Applied Cryptography [Schneier]
- Contemporary cryptography [Opplinger]

# The power of interaction



**Verifier**  
(Victor)



**Prover**  
(Peggy)

# Zero knowledge

- How to state that the prover leaks *no information* ?



*all interactive informations provided by the prover (ie the transcripts) could have been produced offline by the verifier himself alone!*

=> by stating the verifier can produce the transcript of the protocol in (expected) polynomial time alone, with no help of the prover !

- **Def:** a sound and correct interactive protocol is **zero-knowledge** if there exists a *non-interactive randomized polynomial time* algorithm (named « **simulator** ») which, for any input  $x$  accepted by the verifier (using interaction with the prover) can produce transcripts indistinguishable from those resulting from interaction with the real prover.
- **Consequence:** releases no information to an observer.



# Graph [non]-isomorphism and zero knowledge

- In a zero-knowledge protocol, the verifier learns that  $G_1$  is isomorphic to  $G_2$  but nothing else.

**Previous protocol** (slide 24 or next) **not known to be zero-knowledge:**

correct transcript  $X=(G', i, P')$  with  $G'=P_{\text{rand}}(G_{\text{rand}})$  and  $G_i=P'(G')$

- If  $G_1 \neq G_2$  : (we have  $b=i$ )  $\Rightarrow$  Entropy( transcript  $X$  ) =  $1 + \log n!$   
Simulation:  $(P'^{-1}(G_i), i=\text{rand}(1,2), P'=\text{RandPerm}) \stackrel{\text{distribution}}{=} X$   
 $\Rightarrow$  No information revealed !

- If  $G_1$  is isomorphic to  $G_2$  : Prover sends the permutation  $P_i$  such that  $G_1=P_i(G_2)$  : then  $i$  is independent from  $G'$   
Entropy( transcript  $X$  ) =  $2 + \log n!$

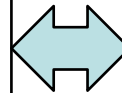
***so the verifier learns 1 additional bit to  
only a random bit and a random permutation***



# Non-known zero knowledge Interactive Algorithm Graph Isomorphism

## Verifier

```
AlgoGraphIso( $G_1=(V_1, E_1)$ ,  $G_2=(V_2, E_2)$ ) {  
  If ( $\#V_1 \neq \#V_2$ ) or ( $\#E_1 \neq \#E_2$ )  
    return "NO :  $G_1$  not isomorphic to  $G_2$ ";  
   $n := \#V_1$  ;  
  For ( $i=1 \dots k$ ) {  
     $P := \text{randompermutation}([1, \dots, n])$  ;  
     $b := \text{random}(\{1,2\})$  ;  
     $G' := P(G_b)$  ;  
    ( $i, P_i$ ) := Call OracleWhichIso( $G_1, G_2, G'$ ) ;  
    If ( $G_i \neq P_i(G')$ ) FAILURE("Oracle is not reliable") ;  
    If ( $b \neq i$ ) return "YES :  $G_1$  is isomorphic to  $G_2$ " ;  
  }  
  return "NO :  $G_1$  not isomorphic to  $G_2$ " ;  
}
```



## Prover

```
OracleWhichIso( $G_1, G_2, G'$ ) {  
  // precondition:  $G'$  is isomorphic to  
  //  $G_1$  or  $G_2$  or both.  
  // Output:  $i$  into  $\{1,2\}$  and a permutation  
  //  $P_i$  such that  $G_i = P(G')$   
  ... ;  
  Return ( $i, P_i$ ) ;  
}
```

**Theorem:** Assuming OracleWhichIso of polynomial time,  
AlgoGraphIso( $G_1, G_2$ ) proves in polynomial time  $k \cdot n^{O(1)}$  that :

- either  $G_1$  is isomorphic to  $G_2$  (no error)
- or  $G_1$  is not isomorphic with error probability  $\leq 2^{-k}$ .

Thus, it is a MonteCarlo (randomized) algorithm for proving GRAPH ISOMORPHISM

# A zero-knowledge interactive proof for Graph Isomorphism

## Verifier

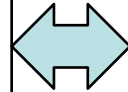
**input:**  $(G_1=(V_1,E_1), G_2=(V_2,E_2))$

Accepts prover if convinced that  $G_1$  is isomorphic to  $G_2$

2. Receives  $H$ ;

Chooses  $b=\text{random}(1,2)$  and sends  $b$  to the prover

4. receives  $P''$  and checks  $H = P''(G_b)$



## Prover

**gets**  $G_1, G_2$

private secret perm.  $P_s: G_2=P_s(G_1)$

1. Chooses a random perm.  $P'$  and sends to verifier  $H=P'(G_2)$

3. Receives  $b$ ;  
if  $b=1$  sends  $P''=P' \circ P_s$  to the verifier  
else  $b=2$ : sends  $P''=P'$  to the verifier

**Theorem:** This is a zero-knowledge, sound and complete, polynomial time interactive proof that the two graphs  $G_1$  and  $G_2$  are isomorphic.

# Zero-knowledge interactive proof for Graph Isomorphism

- Completeness
- Soundness
- Zero-knowledge
- Polynomial time

# Zero-knowledge interactive proof for Graph Isomorphism

- Completeness
  - if  $G_1 = G_2$ , verifier accepts with probability 1.
- Soundness
  - if  $G_1 \neq G_2$ , verifier rejects with probability  $\geq \frac{1}{2}$
- Zero-knowledge
  - Simulation algorithm:
    1. Choose first  $b = \text{rand}(1,2)$  and  $\pi$  random permutation (like  $P'$ );
    2. Compute  $H = \pi(G_b)$  ;
    3. Output transcript  $[H, b, \pi]$  ;
  - The transcript  $[H, b, \pi]$  is distributed uniformly, exactly as the transcript  $[H, b, P']$  in the interactive protocol.
- Polynomial time

# Another simulation algorithm

(following the prover's protocol but cheating)

Simulator:

Do {

1.  $b' = \text{random}(1,2)$  and  $\pi = \text{random}(\text{permutation})$

2. Compute  $H = \pi(G_{b'})$  // prover would send  $H$  to verifier

3.  $b = \text{random}(1,2)$  ; // prover would receive  $b$  from verifier

} while ( $b \neq b'$ ) ; // cheat to find a valid transcript in polytime

Output transcript  $[H, b, \pi]$

- Polynomial time:

- Expectation time =  $\text{Time}_{\text{Loop\_body}} \cdot \sum_{k \geq 0} 2^{-k} \leq 2 \cdot \text{Time}_{\text{Loop\_body}}$

# Exercise

- $N$  is a public integer.  
Provide an interactive polynomial time protocol to prove a verifier that you know the factorization  $N=P.Q$  without revealing it.
  - Application:
    - a sensitive building, authorized people know 2 secret primes  $P$  and  $Q$  (and  $N=PQ$ )
    - The guard knows only  $N$

# Quadratic residue authentication: is this version **perfectly** zero-knowledge?

- A **trusted part T** provides a Blum integer  $n=p.q$ ;  $n$  is public.
- **Alice (Prover) builds her secret and public keys:**
  - For  $i=1, \dots, k$ : chooses at random  $s_i$  coprime to  $n$
  - Compute  $v_i := (s_i^2) \bmod n$ . [NB  $v_i$  ranges over all square coprime to  $n$ ]  
 $v_i = \textbf{quadratic residue}$  that admits  $s_i = \textbf{modular square root}$
  - Secret key:  $s_1, \dots, s_k$
  - Public key:  $v_1, \dots, v_k$  and identity photo, ... registered by T
- **Bob (Verifier) authenticates Alice: Zero-knowledge protocol in 3 messages :**
  1. Alice chooses a random  $r < n$ ; she sends  $y = r^2 \bmod n$  to Bob.
  2. Bob sends  $k$  random bits:  $b_1, \dots, b_k$
  3. Alice computes  $z := r s_1^{b_1} \dots s_k^{b_k} \bmod n$  and sends  $z$  to Bob.  
Bob authenticates iff  $z^2 = y \cdot v_1^{b_1} \dots v_k^{b_k} \bmod n$ .
- **Simulation algorithm** : *is the protocol perfectly zero-knowledge?*
  1. Choose  $k$  random bits  $b_1, \dots, b_k$  and a random  $z < n$ ;  
compute  $w = v_1^{b_1} \dots v_k^{b_k} \bmod n$  and  $y = z^2 \cdot w^{-1} \bmod n$  ;
  2. Transcript is  $[y ; b_1, \dots, b_k ; z]$



# Feige-Fiat-Shamir

## zero-knowledge authentication protocol

- A **trusted part T** computes a Blum integer  $n=p.q$ ;  $n$  is public.
- **Alice (Prover) builds her secret and public keys:**
  - For  $i=1, \dots, k$ : chooses at random  $s_i$  coprime to  $n$
  - Compute  $v_i := (s_i^2) \bmod n$ . [NB  $v_i$  ranges over all square coprime to  $n$ ]  
 $v_i = \textbf{quadratic residue}$  that admits  $s_i = \textbf{modular square root}$
  - Secret key:  $s_1, \dots, s_k$
  - Public key:  $v_1, \dots, v_k$  and identity photo, ... registered by T
- **Bob (Verifier) authenticates Alice: Zero-knowledge protocol in 3 messages :**
  1. Alice chooses a random  $r < n$  and a sign  $u = \pm 1$ ; she sends  $y = u.r^2 \bmod n$  to Bob.
  2. Bob sends  $k$  random bits:  $b_1, \dots, b_k$
  3. Alice computes  $z := r.s_1^{b_1} \dots s_k^{b_k} \bmod n$  and sends  $z$  to Bob.  
Bob authenticates iff  $z^2 = \pm y.v_1^{b_1} \dots v_k^{b_k} \bmod n$ .
- Remark: possible variant: Alice chooses its own modulus  $n$

# Feige-Fiat-Shamir

<i>Truth:</i> <i>X=Alice or anyone else?</i>	<i>Prob( Output of authentication)</i> <b>YES:</b> <i>“Authentication of Alice OK”</i>	<b>NO:</b> <i>“Authentication of Alice KO »</i>
Case X = Alice (completeness)	Always	Impossible
Case X ≠ Alice (soundness)	Prob = $2^{-k}$	Prob = $1 - 2^{-k}$

## ■ Completeness

- Alice is allways authenticated (error prob=0)

## ■ Soundness

- Probability for Eve to impersonate Alice =  $2^{-k}$ . If t rounds are performed:  $2^{-kt}$

## ■ Zero-knowledge

- A simulation algorithm exists that provides a transcript which is indistinguishable with the trace of interaction with correct prover.

# From zero-knowledge authentication to zero knowledge signature

- Only one communication: the message+signature
  - The prover uses a CSPRNG (e.g. a secure hash function) to generate directly the random bits of the challenge
  - The bits are transmitted to the verifier, who verifies the signature.
- Example: Fiat-Shamir signature
  - Alice builds her secret key  $(s_1, \dots, s_k)$  and public key  $(v_1, \dots, v_k)$  as before.
  - Let  $M$  be a message Alice wants to sign.
  - Signature by Alice
    1. For  $i=1, \dots, t$ : chooses randomly  $r_i$  and computes  $w_i$  s.t.  $w_i := r_i^2 \bmod n$ .
    2. Computes  $h = H(M \parallel w_1 \parallel \dots \parallel w_t)$  this gives  $k \cdot t$  bits  $b_{ik}$ , that appear as random (similarly to the ones generated by Bob in step 2 of Feige-Fiat-Shamir)
    3. Alice computes  $z_i := r_i \cdot s_1^{b_{i1}} \cdot \dots \cdot s_k^{b_{ik}} \bmod n$  (for  $i = 1 \dots t$ );  
She sends the message  $M$  and its signature:  $\sigma = (z_1 \dots z_t, b_{11} \dots b_{tk})$  to Dan
  - Verification of signature  $\sigma$  by Dan:
    1. Dan computes  $y_i := z_i^2 \cdot (v_1^{b_{i1}} \cdot \dots \cdot v_k^{b_{ik}})^{-1} \bmod n$  for  $i=1 \dots t$   
A correct signature gives  $y_i = w_i$
    2. Computes  $H(M, \parallel y_1 \parallel \dots \parallel y_t)$  and he verifies that he obtains the bits  $b_{ik}$  in Alice's signature

# Zero-knowledge vs other asymmetric protocols

- No degradation with usage.
- No need of encryption algorithm.
- Efficiency: often higher communication/computation overheads in zero-knowledge protocols than public-key protocols.
- For both , provable security relies on conjectures (eg: intractability of quadratic residuosity)

# Exercise

- Guillou-Quisquater zero-knowledge authentication and signature protocol.

# Feige-Fiat-Shamir

## zero-knowledge authentication protocol

- A **trusted part T** (or Alice) computes a Blum integer  $n=p.q$ ;  $n$  is public.
- **Alice (Prover) builds her secret and public keys:**
  - For  $i=1, \dots, k$ : chooses at random  $s_i$  coprime to  $n$  and  $n$  random bits  $d_i$
  - Compute  $v_i := (s_i^2) \bmod n$ . [NB  $v_i$  ranges over all square coprime to  $n$ ]  
 $(-1)^{d_i} v_i = \textbf{quadratic residue}$  that admits  $s_i = \textbf{modular square root}$
  - Secret key:  $s_1, \dots, s_k$ . (Note that  $v_i \cdot s_i^2 = (-1)^{d_i} = 1$  or  $-1 \bmod n$ )
  - Public key:  $v_1, \dots, v_k$  and identity photo, ... registered by T
- **Bob (Verifier) authenticates Alice: Zero-knowledge protocol in 3 msgs :**
  1. Alice chooses a random value  $r < n$ . She sends  $y := r^2 \bmod n$  to Bob.
  2. Bob sends  $k$  random bits:  $b_1, \dots, b_k$
  3. Alice computes  $z := r \cdot s_1^{b_1} \cdot \dots \cdot s_k^{b_k} \bmod n$  and sends  $z$  to Bob.  
 Bob computes  $w = z^2 \cdot v_1^{b_1} \cdot \dots \cdot v_k^{b_k}$  and authenticates iff  $y=w$  or  $y=-w \bmod n$ .
- Soundness and completeness, perfectly zero knowledge
  - Probability for Eve to impersonate Alice =  $2^{-k}$ . If  $t$  rounds are performed:  $2^{-kt}$
  - Alice always authenticated (error prob=0)
  - Zero knowledge: transcript

# Interactive zero knowledge protocol

## *What have we learned?*

- Soundness + completeness
- Interactive proof (computers, profs) >> static proof (books)
- Zero-knowledge: simulation that provides a transcript indistinguishable from the correct interaction!
- Everywhere in crypto:
  - Authentication, signature, security proofs (IND-CCX)
- Perspective: outsourcing with verifiable trust





# Outsourcing computations and security

Jean-Louis Roch

*Grenoble INP-Ensimag, Grenoble-Alpes University, France*

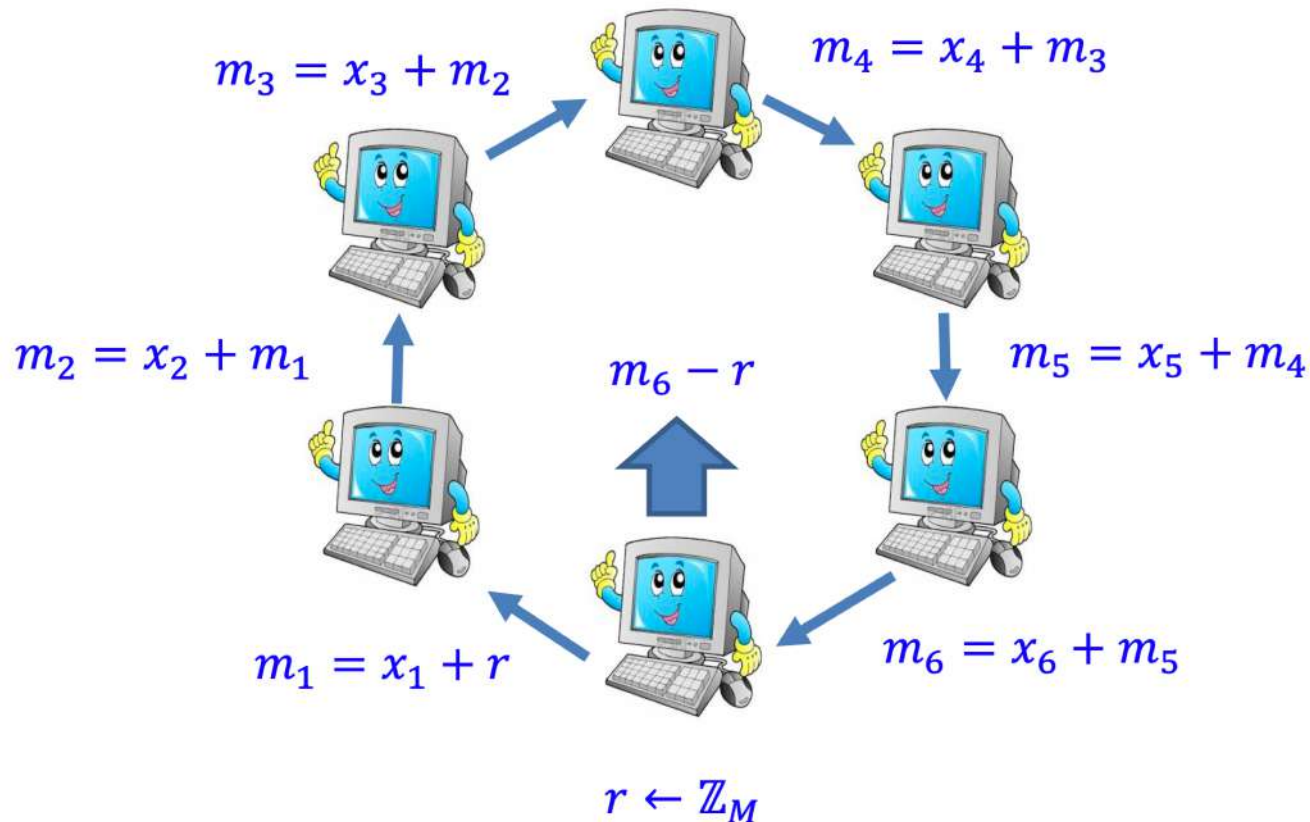
1. Computation with encrypted data : FHE
2. Interactive verification of results
3. Zero-knowledge proofs
  - Interactive zero-knowledge protocols
  - exercise
- 4. Secure multiparty computations**

# Secure multiparty computation

- Examples [Ran Cohen lecture : <https://www.cs.tau.ac.il/~iftachh/Courses/Seminars/MPC/Intro.pdf>]
- $n$  parties  $P_i$ . Each party  $P_i$  has a secret  $x_i$
- All parties jointly compute  $y=f(x_1, \dots, x_n)$ 
  - without revealing information on any secret  $x_i$  (except  $y$ )
- The computation must preserve certain security properties
  - Even if some parties collude and attack the protocol
- Basic solutions : rely on TTP
  - Each party sends her secret  $x_i$  to TTP;
  - TTP computes  $y=f(x_1, \dots, x_n)$  and sends it to a verifier
  - Verifier sends  $y$  to the parties (that may verify it too)
  - Eg the voting protocol with FHE (see section 1)
- Can we do as well without any TTP ?

# Multi-party Computation without TTP

- Eg: compute  $\sum x_i$



- Note this scheme is not resistant facing corruption(s)

# Oblivious transfer 1 among 2

- Alice has 2 plaintexts  $M_0$  and  $M_1$
- Bob asks Alice to send him  $M_s$  without revealing to Alice he wants  $M_0$  or  $M_1$ .

# Oblivious transfer 1 among 2

- Alice has 2 plaintexts  $M_0$  and  $M_1$
- Bob asks Alice to send him  $M_s$  without revealing to Alice he wants  $M_0$  or  $M_1$ .
- One solution: (with multiplicative RSA)
  - Alice has RSA public  $(n,e)$  and secret  $d$
  - Alice chooses random  $r_0$  and  $r_1$   
and she sends  $x_0=r_0^e \bmod n$  and  $x_1=r_1^e \bmod n$  to Bob
  - Bob chooses random  $k$  and sends  $v=(x_s + k^e) \bmod n$  to Alice
  - Alice compute  $C_0 = M_0+(v-x_0)^d \bmod n$  and  $C_1 = M_1+(v-x_1)^d \bmod n$   
She sends  $C_0$  and  $C_1$  to Bob
  - Bob computes  $C_s - k$  and obtains his desired  $M_s$ .
- Note : a solution with FHE sends only one message  $C$   
(but Alice computes all  $C_i$  with Bob public key)

# Secret sharing problem

## « $k$ among $n$ »:

- $S$  is a shared secret among  $n$  entities :
  - $S$  is known by a TTP
  - $S$  is represented by  $D_1, \dots, D_n$  with  $D_i$  secret of  $i$
  - Knowledge of at least  $k$  values enables to compute  $S$
  - Knowledge of less of  $k-1$   $D_i$  provides no information on  $S$

# Shamir protocol for secret sharing

- Use error correcting codes...
- Let  $F$  a (large) finite field such that  $S$  is uniquely and secretly represented in  $F$ 
  - $\text{Prob}(S=x) = 1/\text{card}(F)$
- **Shamir's Protocol**
  - Let  $f(X) = S + a_1.X + a_2.X^2 + \dots + a_{k-1}.X^{k-1}$  with  $a_1, \dots, a_{k-1}$  randomly chosen in  $F$  (let  $a_0=S$ )
  - Let  $n$  distinct elements  $w_i \neq 0$  in  $F$   
(for instance  $w_i = i$  if  $\text{characteristic}(F) > n$ , or  $w_i = g^i$  etc)
  - Each party  $i$  owns  $(w_i, f(w_i))$
- **Multiparty computation of the secret by  $k$  parties :**
  - by interpolation of  $f$  (degree  $k-1$ ) from  $k$  values  $f(w_i)$  : CRT
  - If less than  $k-1$  values: then all values for  $S$  have same probability
- Moreover: resist to errors
  - possibility of correcting  $r$  errors (or attacks)
    - with  $k+r$  values si  $r \geq 2.\#errors$

# Shamir's protocol properties

- **Perfect secrecy** (indistinguishability, like OTP)
- **Minimal**: la taille de chaque  $D_i$  n'est pas plus grande que la taille de  $S$
- **Dynamic** possible to change the polynomial from time to time
- **Extendable** : adding parties is possible
- **Flexible**: party with high priority owns several values
- But requires confidence in the TTP that distributes the value



# Conclusion

## Outsourcing computations and security

1. Computation with encrypted data : FHE
2. Interactive verification of results
3. Zero-knowledge proofs
  - Interactive zero-knowledge protocols
  - exercise
4. Secure multiparty Computations



# Shamir protocol for multiparty computation

- Example to compute (F)
- **Shamir's Protocol**
  - Let  $f(X) = S + a_1.X + a_2.X^2 + \dots + a_{k-1}.X^{k-1}$  with  $a_1, \dots, a_{k-1}$  randomly chosen in  $F$  (let  $a_0 = S$ )
  - Let  $n$  distinct elements  $w_i \neq 0$  in  $F$   
(for instance  $w_i = i$  if  $\text{characteristic}(F) > n$ , or  $w_i = g^i$  etc)
  - Each party  $i$  owns  $(w_i, f(w_i))$
- **Multiparty computation of the secret by  $k$  parties :**
  - by interpolation of  $f$  (degree  $k-1$ ) from  $k$  values  $f(w_i)$  : CRT
  - If less than  $k-1$  values: then all values for  $S$  have same probability
- Moreover: resist to errors
  - possibility of correcting  $r$  errors (or attacks)
    - with  $k+r$  values si  $r \geq 2.\#errors$