#### Course Announcements

- Assignments
  - Homework 9 is due 4/8, no HW for the following 2 weeks
  - Class project has been posted (see Piazza post 302), due Wednesday 4/22
  - Reading: Secure Multiparty Computation for Privacy-Preserving Data Mining
- Notes
  - This course is moving to fall-only starting this fall, tell your friends!

### Lecture 18: Protecting Data in Use against Mallory

- 1. MPC against Eve
- 2. MPC for Boolean circuits
- 3. MPC with preprocessing
- 4. MPC against Mallory

### Objective of secure multi-party computation (MPC)

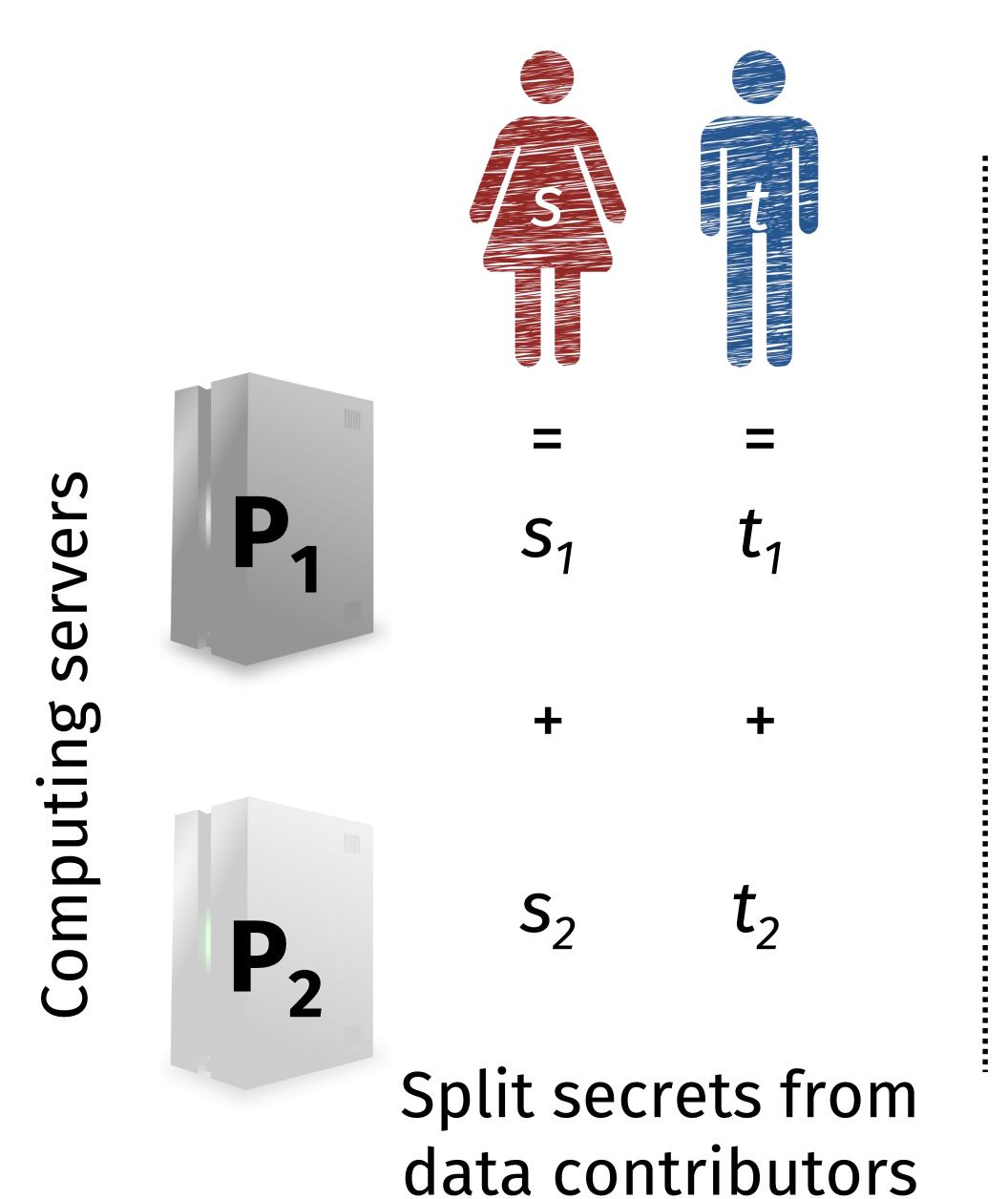
- Given multiple parties  $P_1$ ,  $P_2$ , ...,  $P_n$  each with private data  $x_1$ ,  $x_2$ , ...,  $x_n$
- Parties engage in computing a publicly-known function f

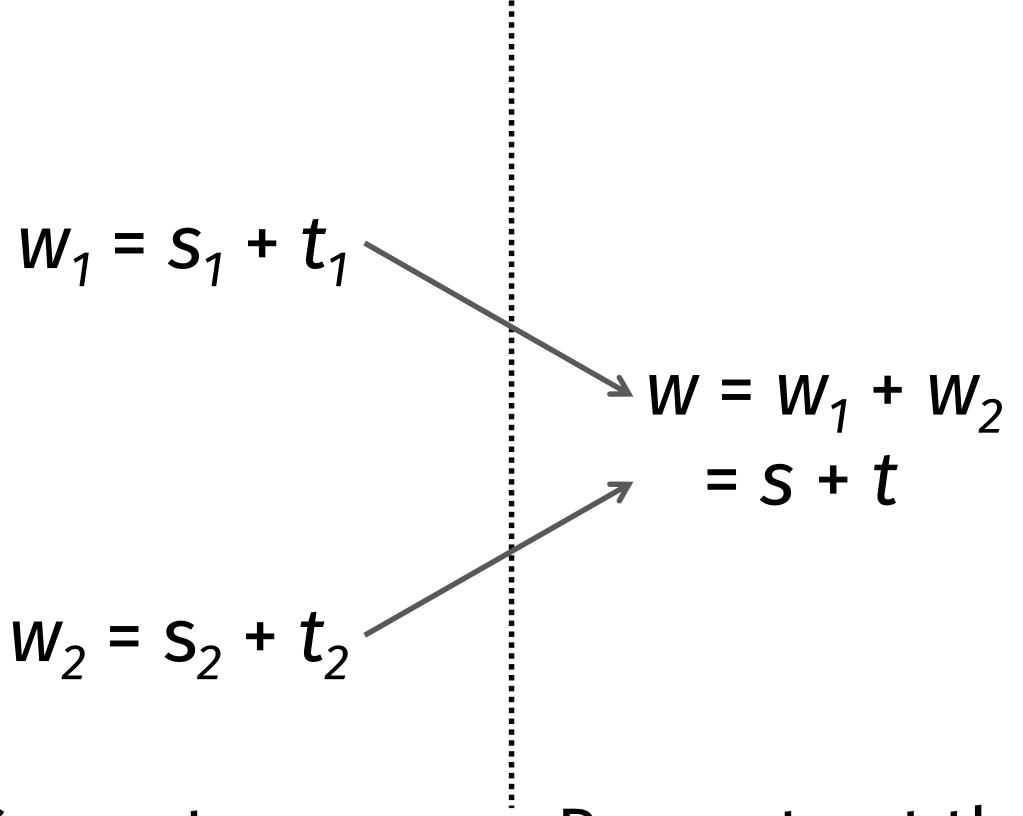
$$y = f(x_1, x_2, x_3, ...)$$

- Assume that at most t of the n parties are adversarial
  - They might collectively be acting as a passive Eve or an active Mallory
- Then, nothing is revealed about the inputs beyond what can be inferred from the output y (note: this inference problem can be challenging)
- Special case: zero knowledge proofs in which prover P(x, w) wants to convince verifier V(x) that  $x \in L$  without revealing w

# 1. MPC against Eve

### Review: secure addition [s + t] = [s] + [t]

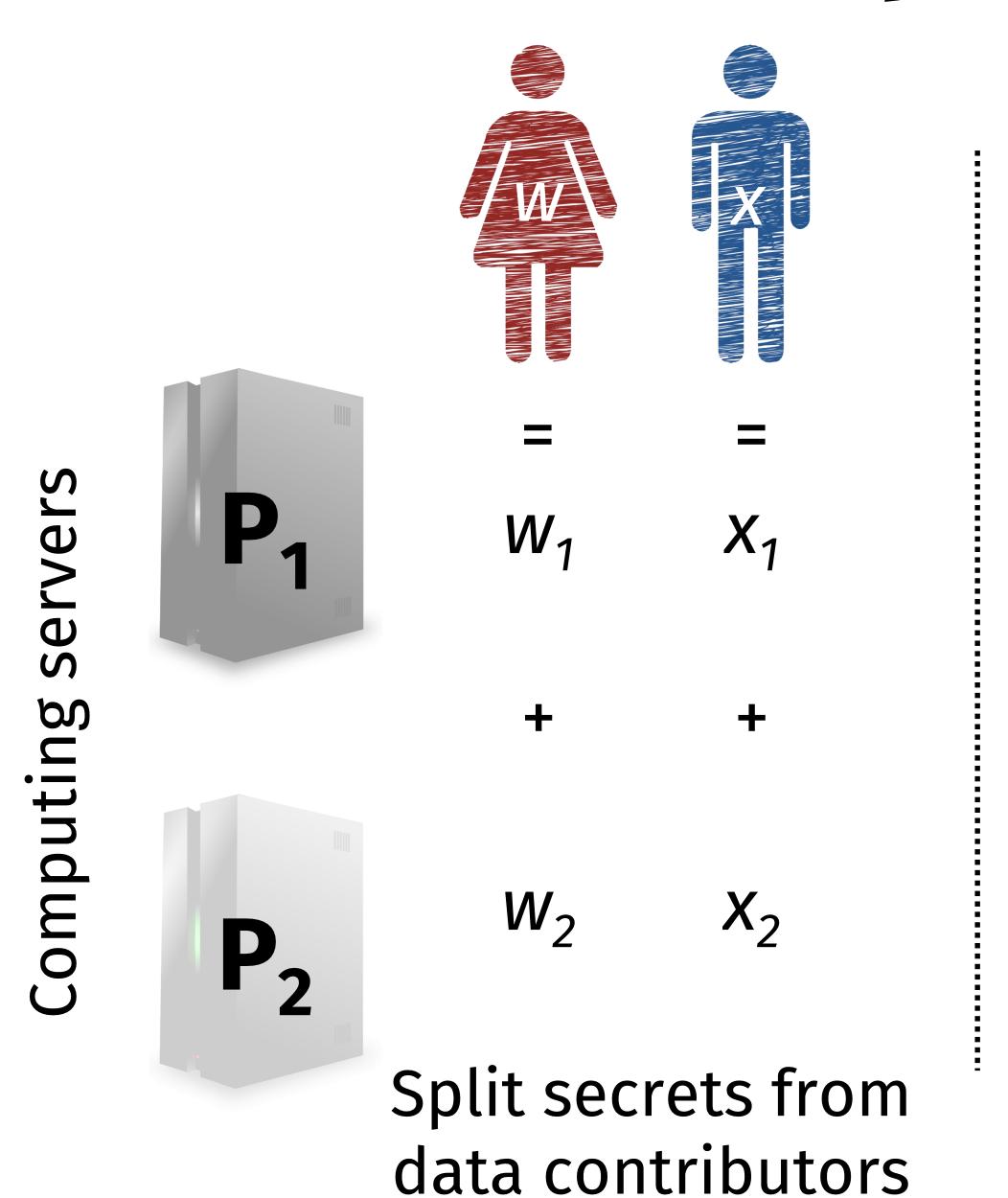




Compute over secret shares

Reconstruct the final answer

### Review: secure multiplication?

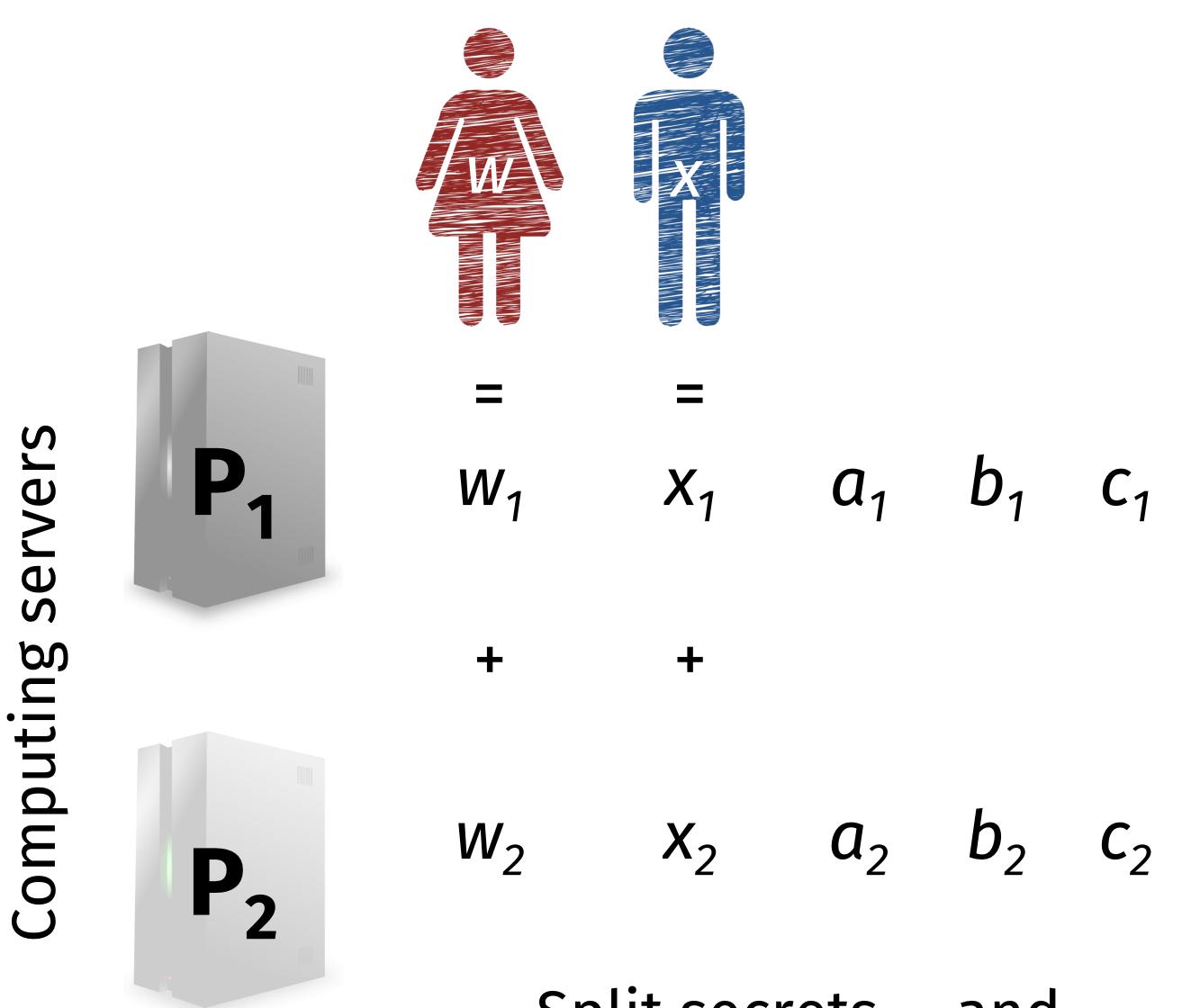


 $y_1 = ???$ = W \* X

Compute over secret shares

Reconstruct the final answer

### Review: secure multiplication with help



Split secrets ... and random a, b, c with a \* b = c

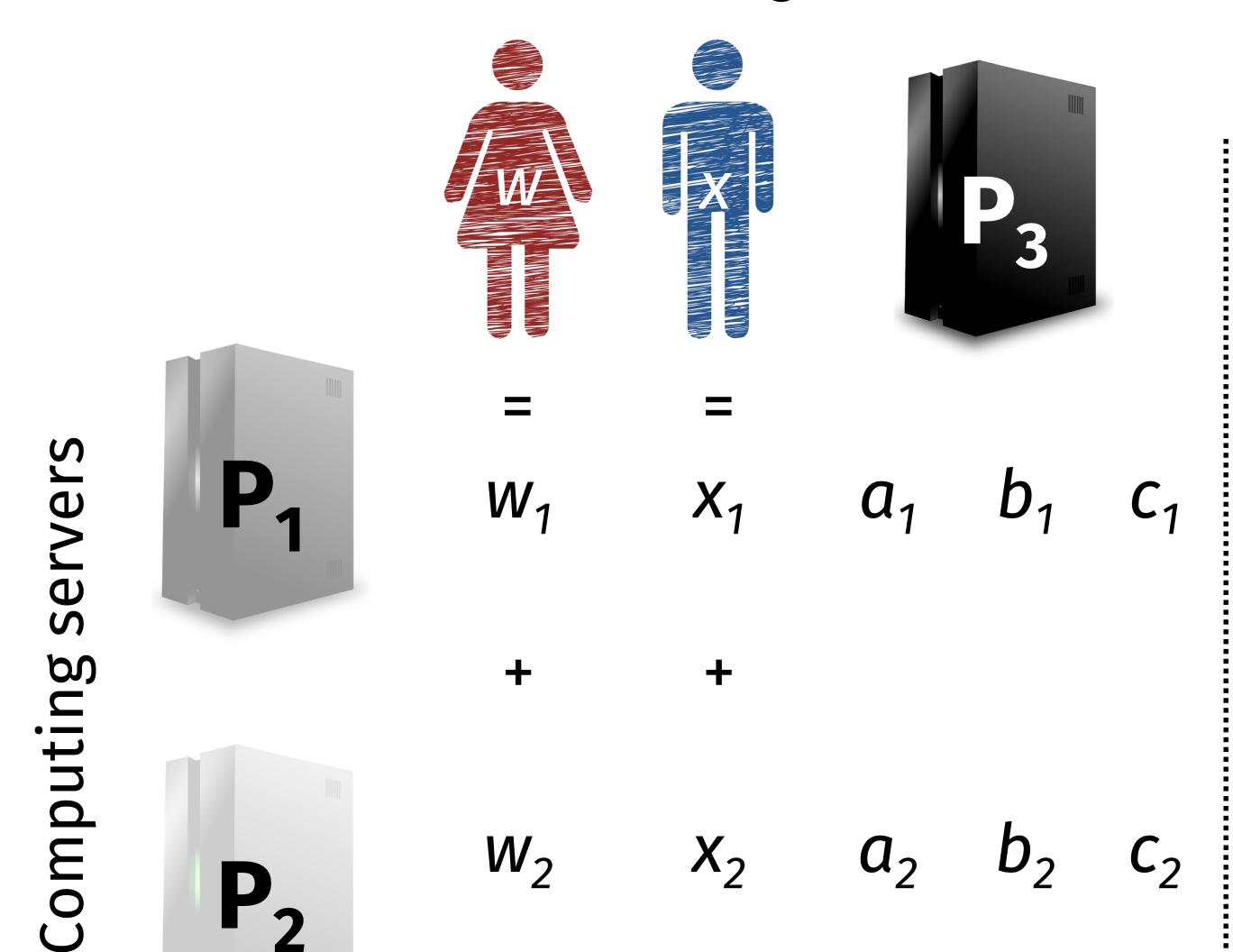
$$[d] = [w] - [a]$$
  
 $[e] = [x] - [b]$ 

open d, e

$$[y] = de + d[b] + e[a] + [c]$$

Compute over secret shares

### Add a third party P<sub>3</sub> to generate hints

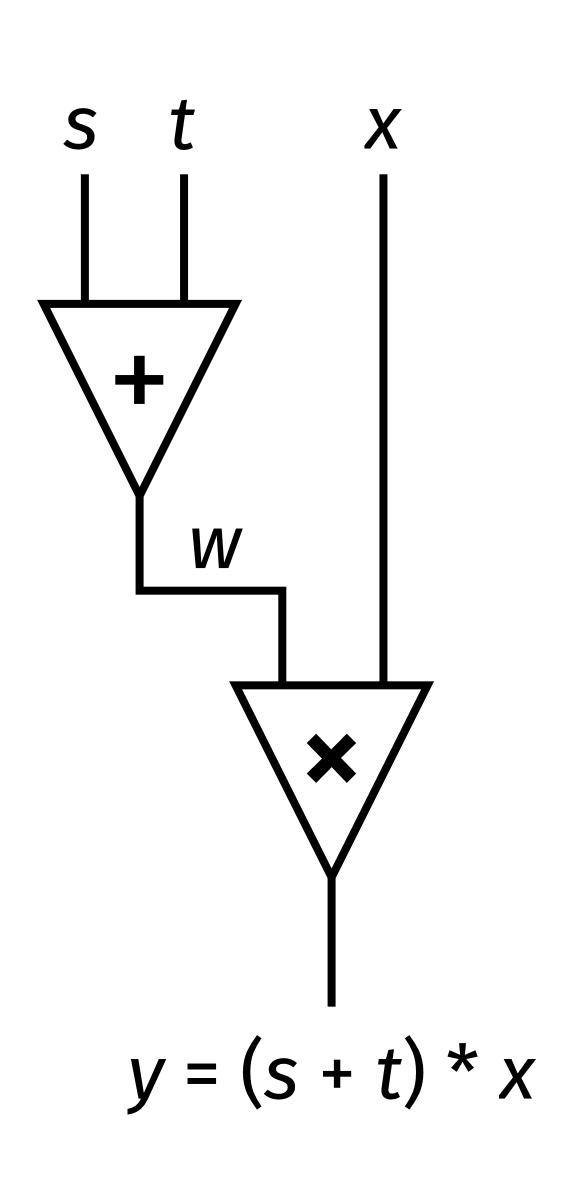


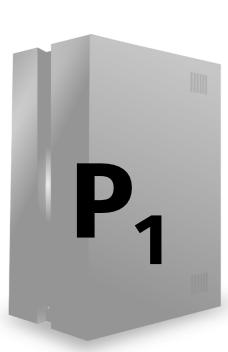
$$[d] = [w] - [a]$$
  
 $[e] = [x] - [b]$ 

open d, e

$$[y] = de + d[b] + e[a] + [c]$$

### Putting it all together





start: *s*<sub>1</sub>, *t*<sub>1</sub>, *x*<sub>1</sub>

$$W_1 = S_1 + t_1$$

$$d_1 = w_1 - a_1$$
  
 $e_1 = x_1 - b_1$ 

$$y_1 = de + db_1 + ea_1 + c_1$$



start: *s*<sub>2</sub>, *t*<sub>2</sub>, *x*<sub>2</sub>

$$W_2 = S_2 + t_2$$

P<sub>3</sub>

start: nothing

pick a, b, c=ab split a, b, c

$$y_2 = db_2 + ea_2 + c_2$$

### Security against Eve

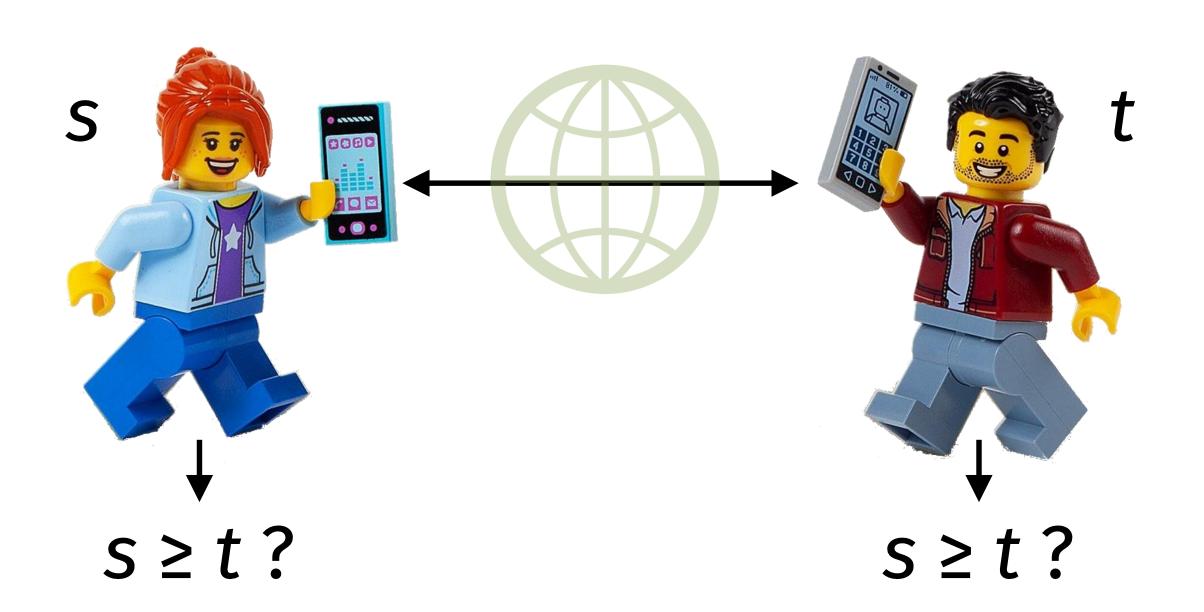
- Claim: if all three servers follow the protocol, no server learns any data
  - $P_1$  and  $P_2$  each hold 1 share of each secret, the other serves as a one-time pad
  - P<sub>3</sub> never receives any information in the entire protocol
- However, protocol is unsafe if one server is an active Mallory
  - Bad: If Mallory =  $P_1$ , she can tamper with the output. Calculating a bad share  $y_1' = y_1 + 1$  causes a corresponding change to the hidden value y' = y + 1
  - Worse: Some protocols that are only secure against Eve might permit Mallory to learn secrets as well (see this week's reading assignment)

### Recall: Secure computation of everything

- + and \* form a Turing-complete set of gates
- Ergo, we can compose them to do secure computation of any function f
- (This may not be the fastest way to compute f securely, however...)

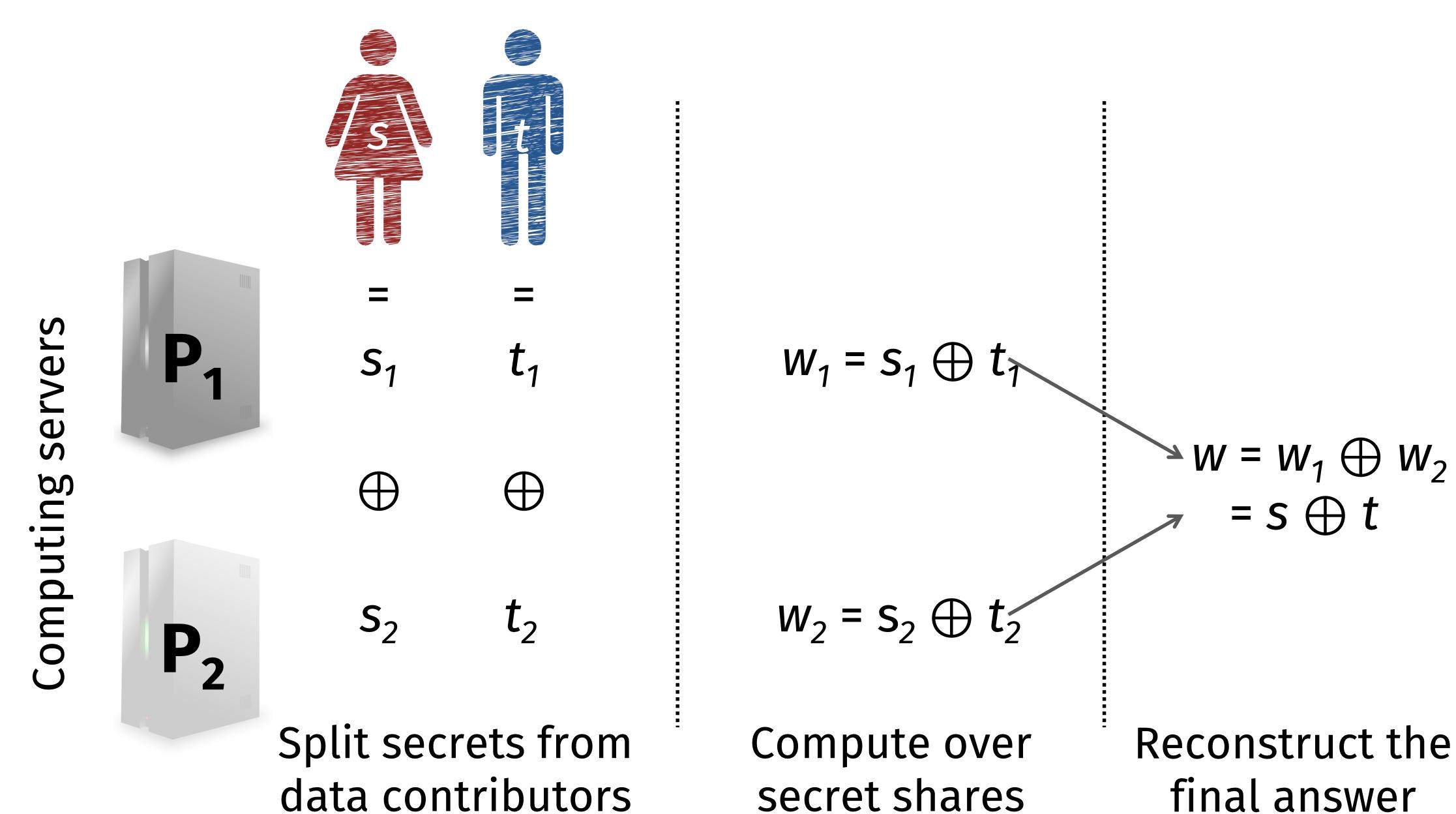
## 2. MPC for Boolean circuits

### Yao's millionaires problem

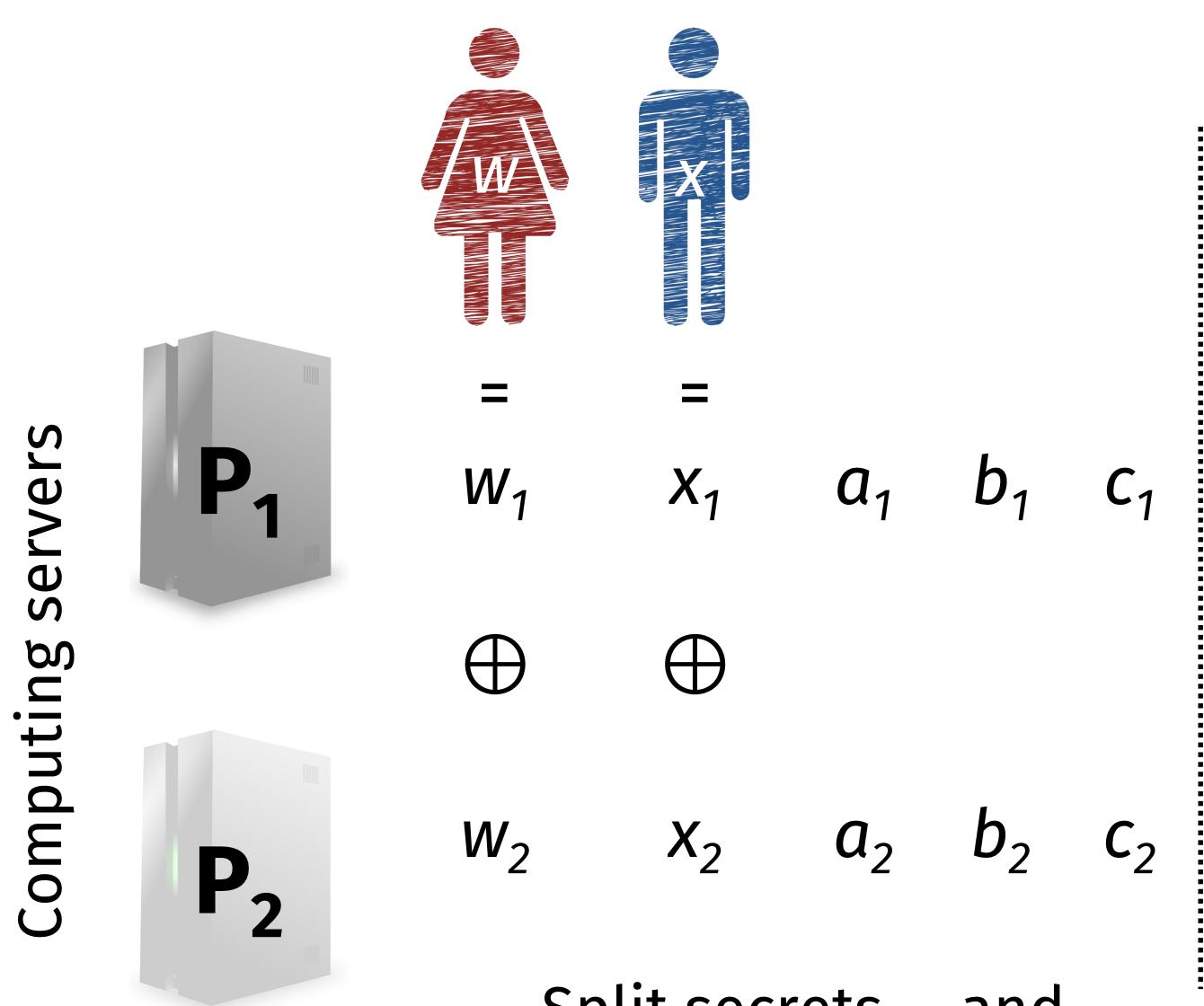


- Alice and Bob know their own salaries (s and t, respectively)
- They want to know if  $s \ge t$
- You can convert ≥ into an arithmetic circuit... but it's large
- Much easier to compute ≥ on the bit representation of s and t

### Secure Boolean XOR: a new way to split secrets!



### Secure Boolean AND... with help from P<sub>3</sub>



Split secrets ... and random a, b, c with  $a \wedge b = c$ 

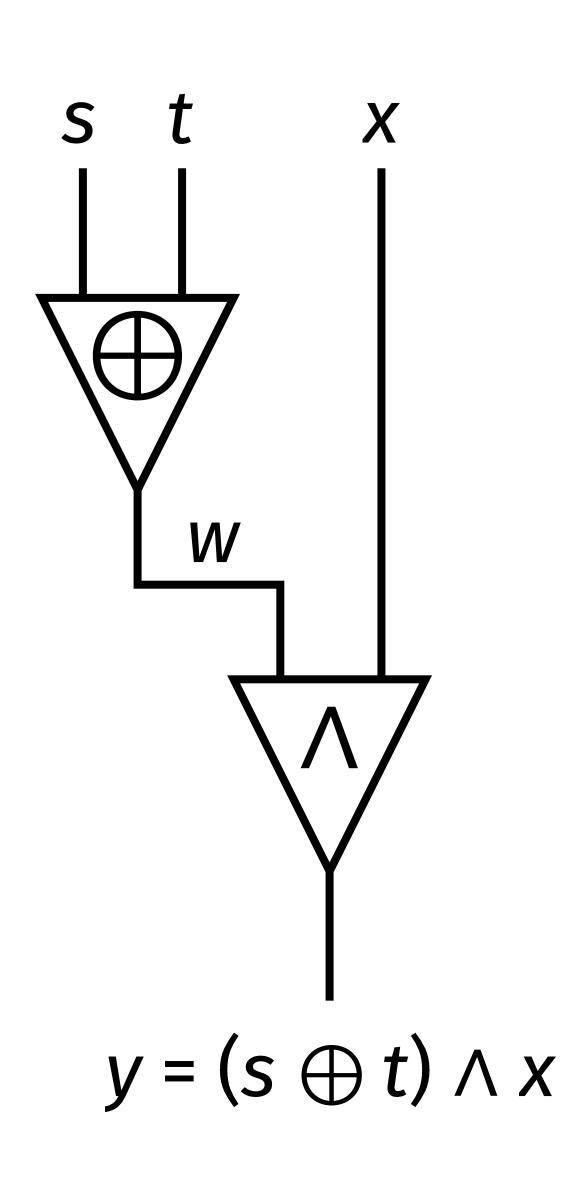
$$[d] = [w] \oplus [a]$$
$$[e] = [x] \oplus [b]$$

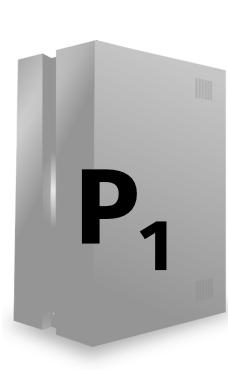
open d, e

$$[y] = de \oplus d[b] \oplus e[a] \oplus [c]$$

Compute over secret shares

### Combined MPC for a Boolean circuit





start: *s*<sub>1</sub>, *t*<sub>1</sub>, *x*<sub>1</sub>

$$W_1 = S_1 \oplus t_1$$

$$d_1 = W_1 \bigoplus a_1$$

$$e_1 = X_1 \bigoplus b_1$$

$$y_1 = de \bigoplus db_1$$

$$\bigoplus ea_1 \bigoplus c_1$$



start:  $s_2$ ,  $t_2$ ,  $x_2$ 

$$W_2 = S_2 \oplus t_2$$

$$d_1 = w_1 \oplus a_1$$
  $d_2 = w_2 \oplus a_2$   
 $e_1 = x_1 \oplus b_1 \longleftrightarrow e_2 = x_2 \oplus b_2$ 



start: nothing

$$y_2 = db_2 \oplus ea_2 \oplus c_2$$

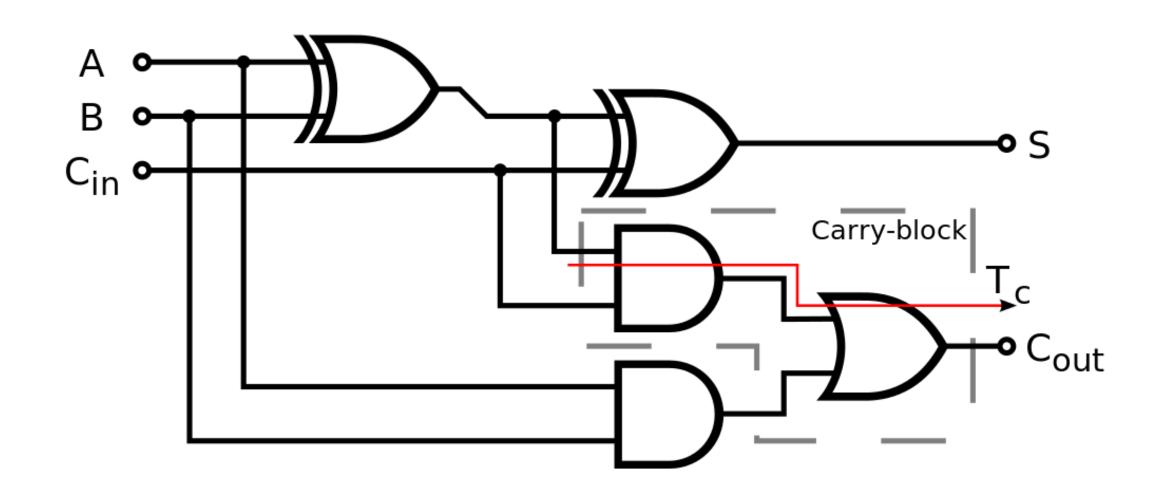
### Converting between arithmetic and boolean

#### Problem

- Compute parties have an additive sharing [x] of secret  $x = x_1 \oplus x_2$
- Want a Boolean sharing  $x = x'_1 \oplus x'_2$

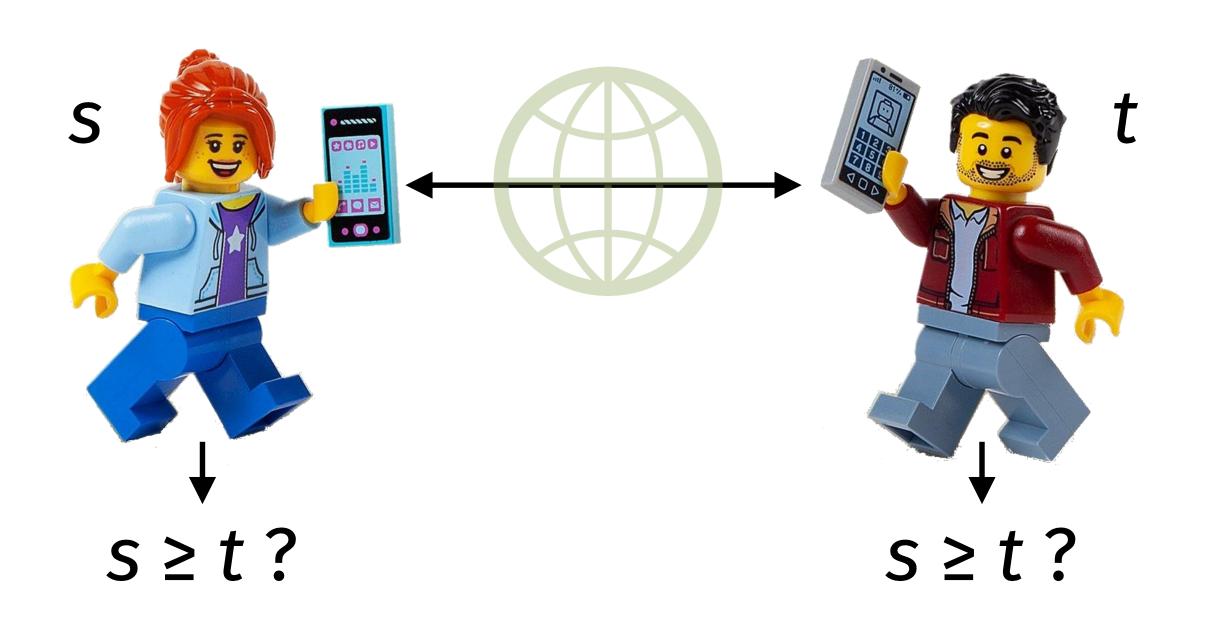
#### Solution

- $P_1$  imagines that  $x_1$  is a fresh secret, makes Boolean splitting  $x_1 = x_{12} \oplus x_{12}$
- $P_2$  does the same:  $X_2 = X_{22} \oplus X_{22}$
- Securely compute the Boolean circuit that does ripple-carry addition of x<sub>i</sub>
- Result: Boolean sharing of the sum x



Source: https://en.wikipedia.org/wiki/Adder\_(electronics)

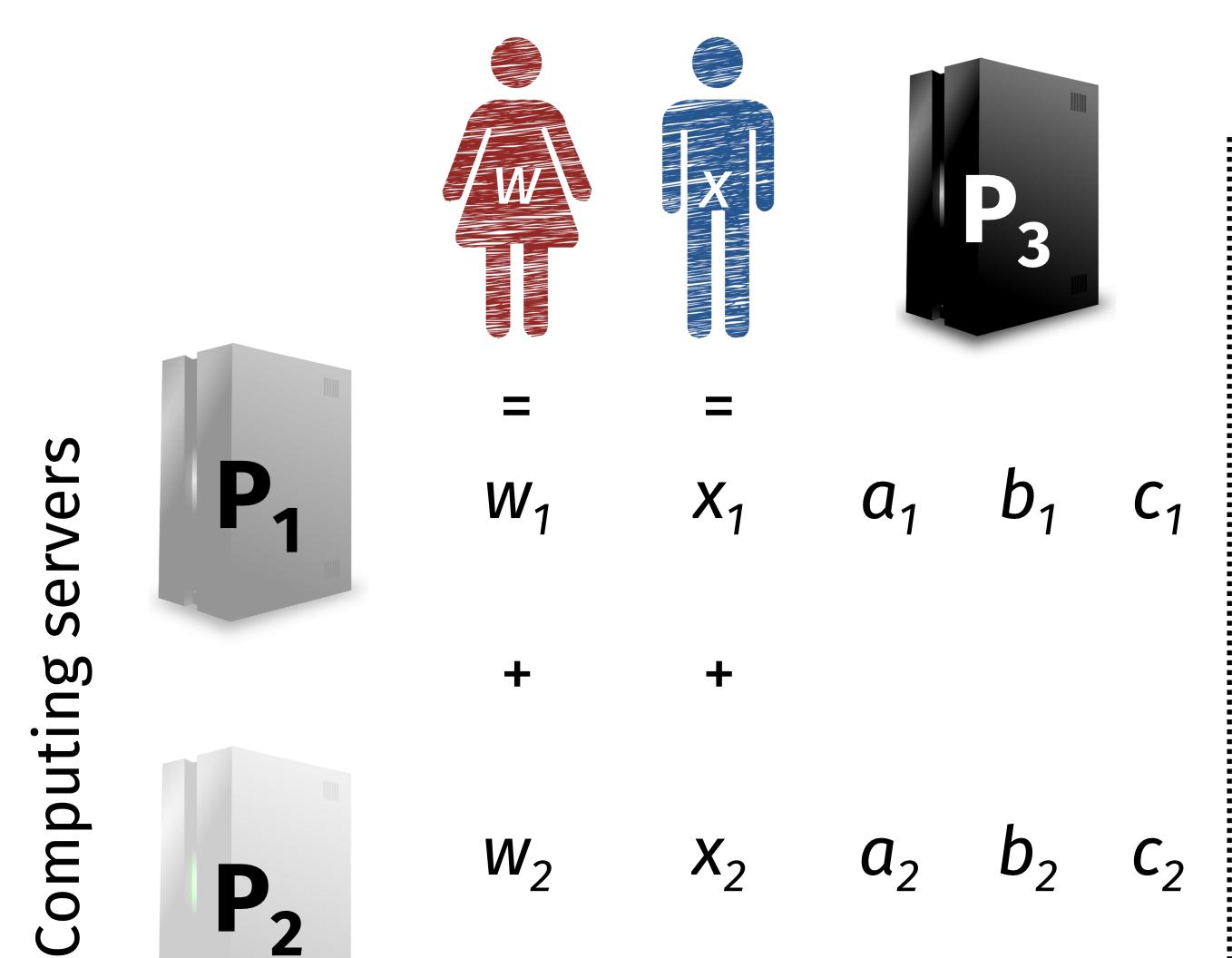
### Solving Yao's millionaires problem



- If salaries are one bit long: answer = s
- Given 2-bit salaries  $s=s^2s^1$ : answer =  $(s^2 \oplus t^2) \land s^2$  $\oplus (s^2 \oplus t^2 \oplus 1) \land s^1$
- Given 3-bit salaries: same idea...
- Important: cannot 'short circuit' a secure computation

# 3. MPC with preprocessing

### **Observe: "hints" from P<sub>3</sub> are data-independent**

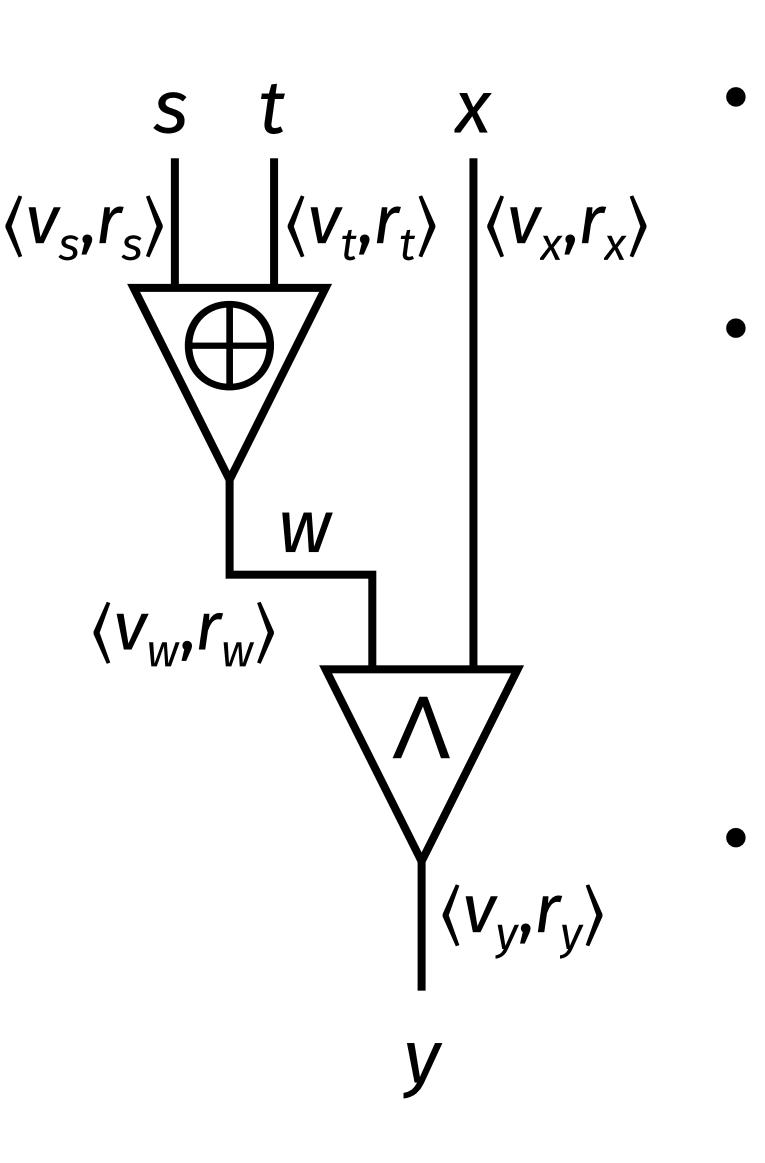


$$[d] = [w] - [a]$$
  
 $[e] = [x] - [b]$ 

open d, e

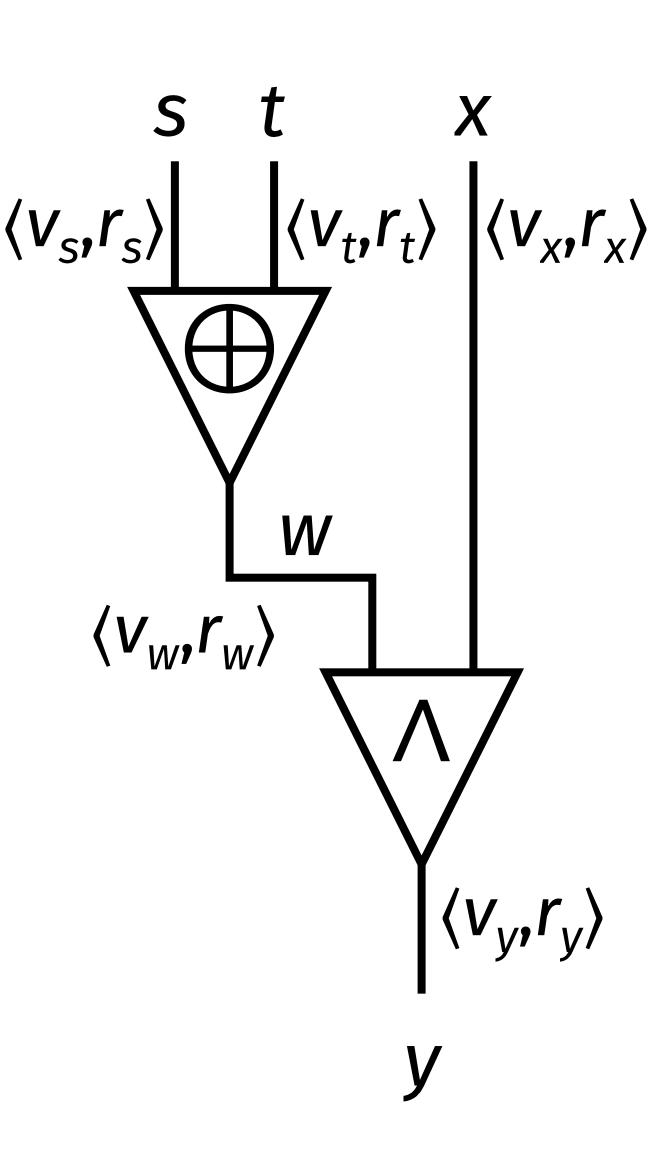
$$[y] = de + d[b] + e[a] + [c]$$

### Pre-processing



- New plan: we will consider two values for every wire s: the secret value  $v_s$  and an independent, random  $r_s$
- $P_3$  can pre-compute the entire circuit on the  $r_w$ 
  - Sample  $r_s$ ,  $r_t$ ,  $r_x$  uniformly at random
  - Compute  $r_w = r_s + r_t$
  - Compute  $r_v = r_w * r_x$  (note: mult has one extra detail...)
- $P_3$  gives  $P_1$  and  $P_2$  one share [r] of each random value

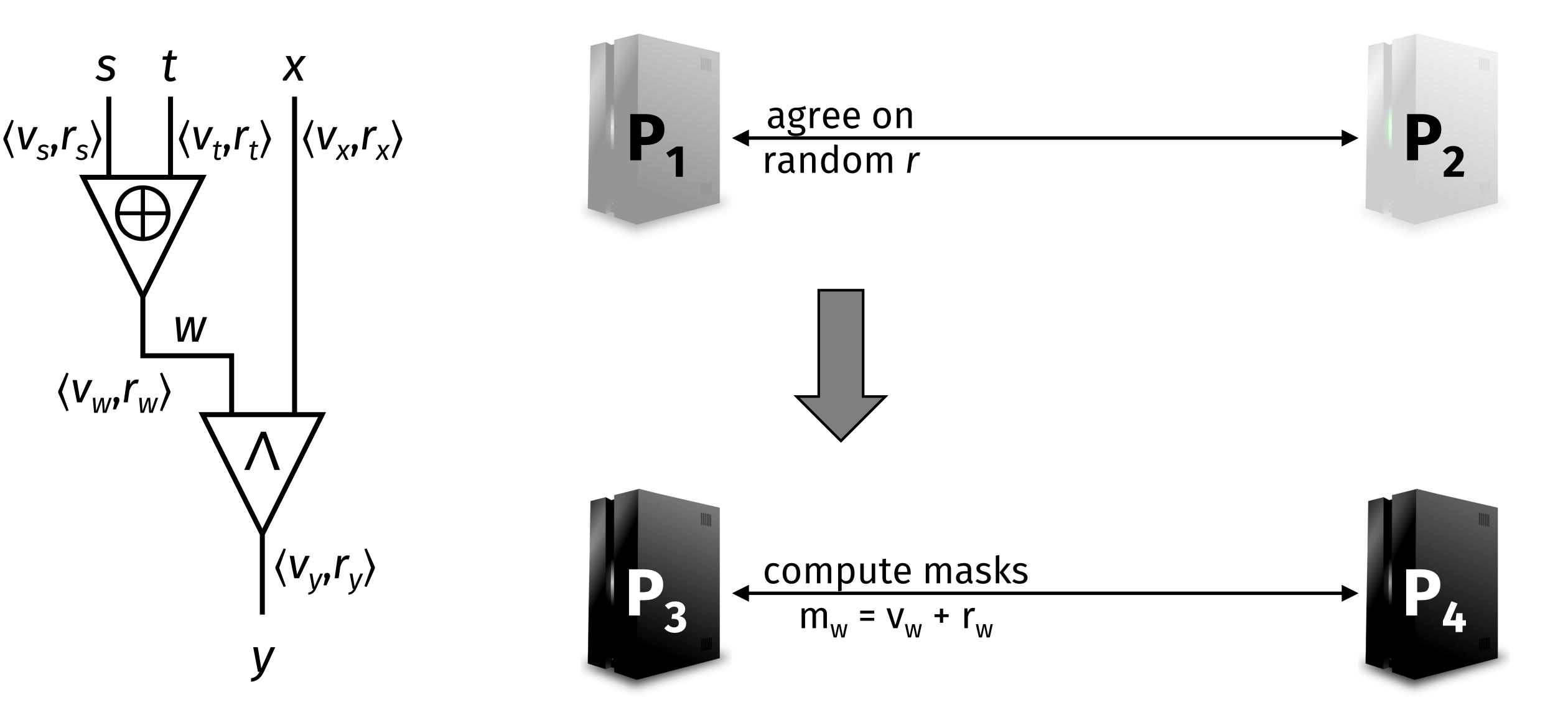
### Compute on masked data



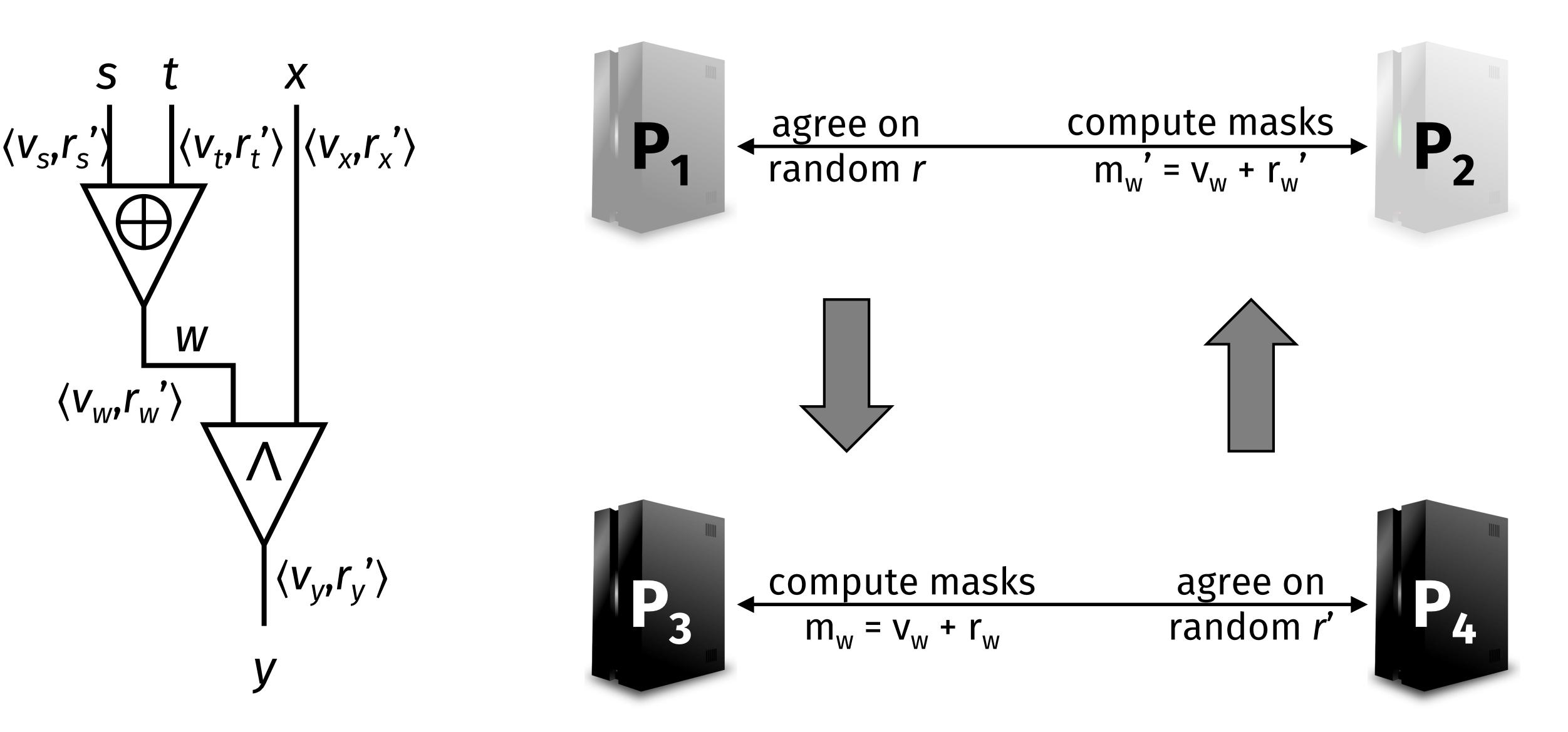
- Data holders use random r as a one-time pad,  $P_1$  and  $P_2$  are given "masked" wire values  $m_s = v_s + r_s$
- P<sub>1</sub> and P<sub>2</sub> compute all masks in the clear (no shares!)
- Addition of masks gives addition of real values: set  $m_w riangleq m_s + m_t$ , then  $v_w = (m_s r_s) + (m_t r_t) = v_s + v_t$
- Multiplication of masks follows our algebra trick: set  $[m_y] \triangleq m_w m_x m_w [r_x] m_w [r_x] + r_y$  and open  $m_y$
- Invariant: none of the compute parties learn any  $v_s$
- Reveal y to the output party by providing  $v_v$  and  $r_v$

# 4. MPC against Mallory

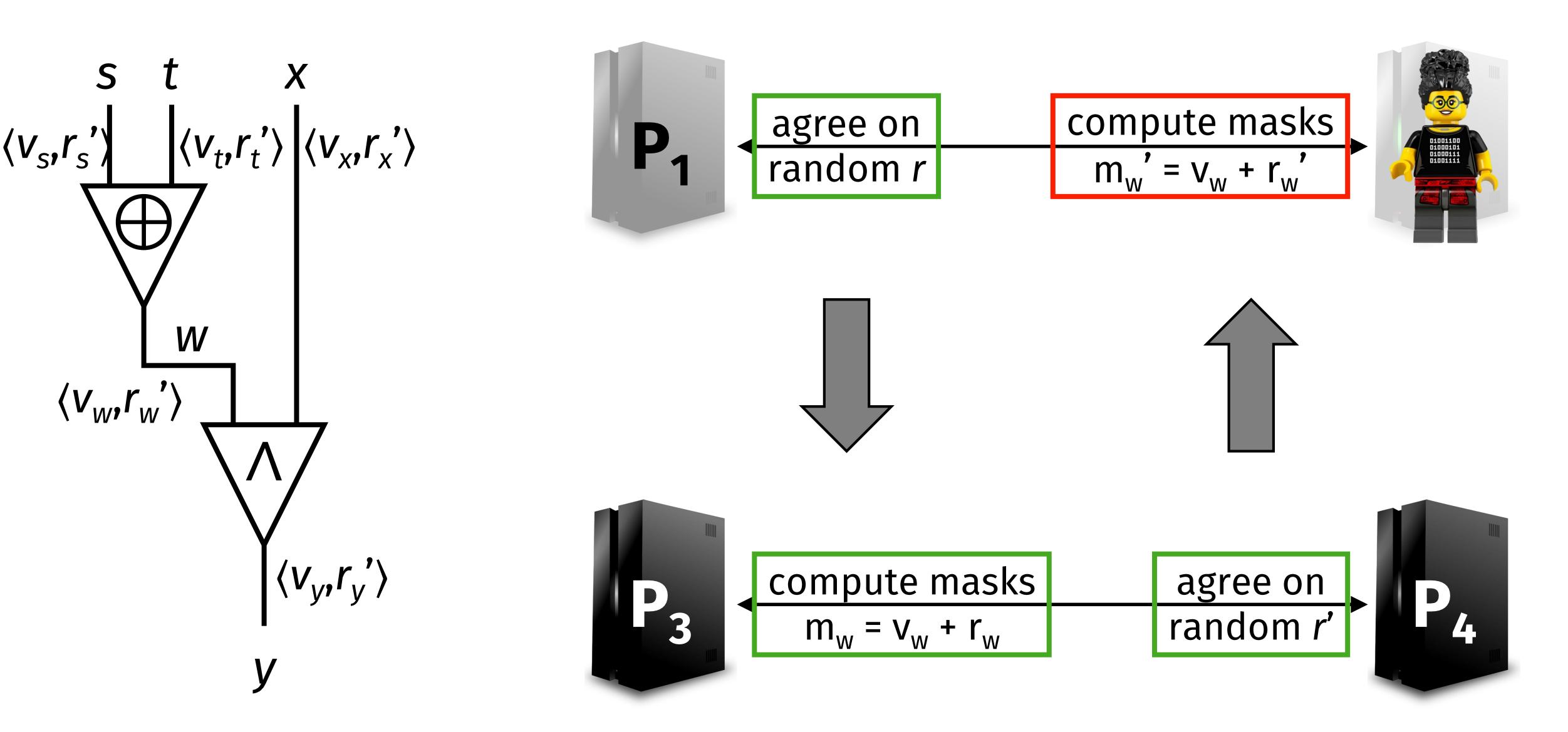
### Add a fourth party P<sub>4</sub> for redundancy



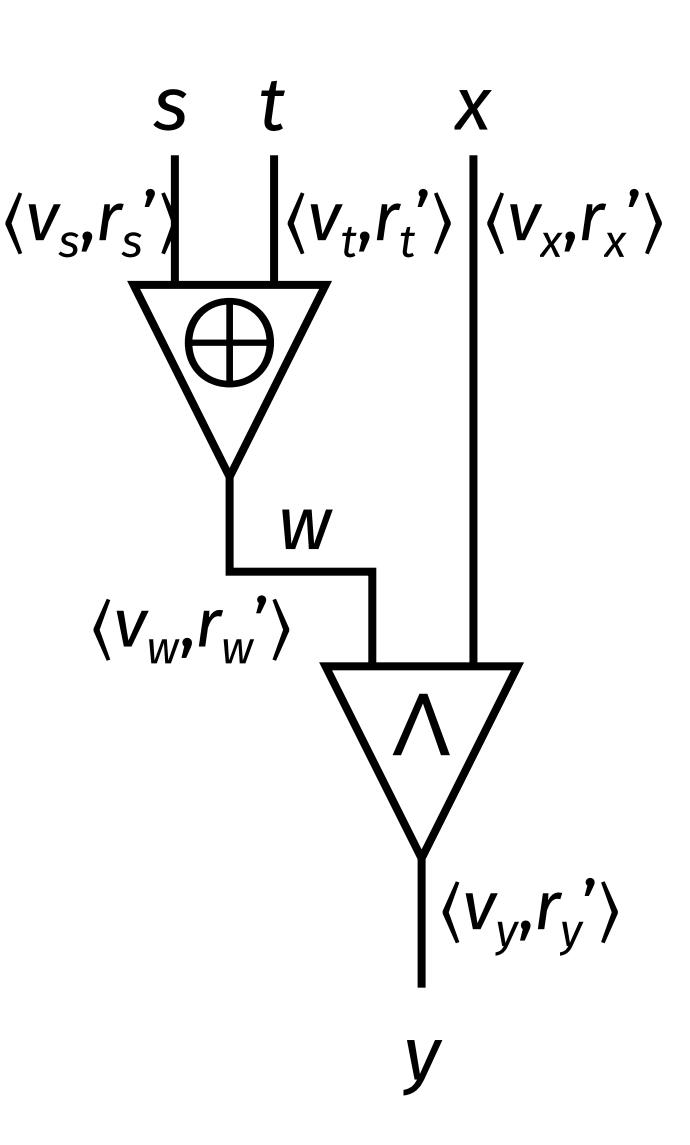
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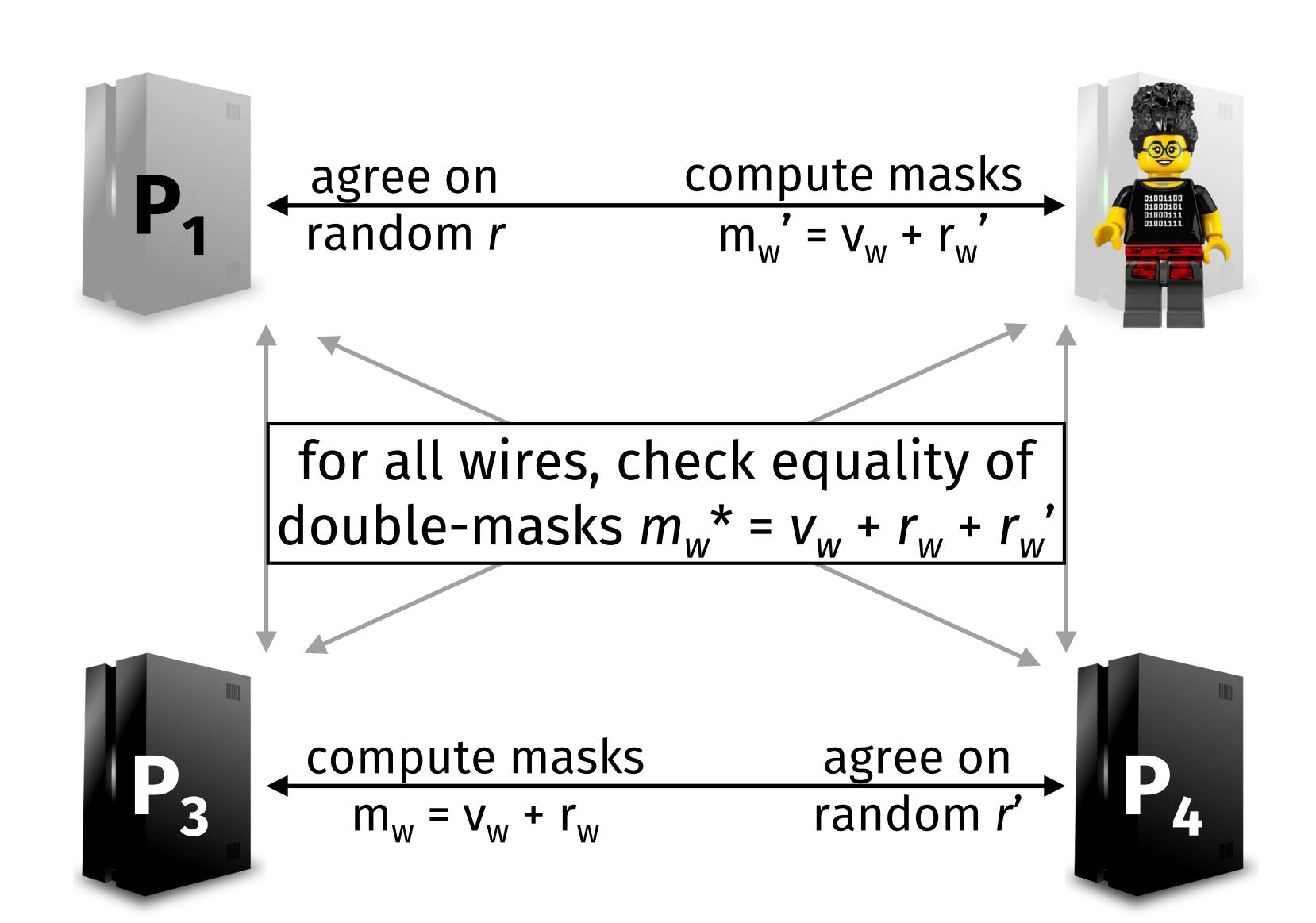


### Secure against Mallory?



### Secure against Mallory!

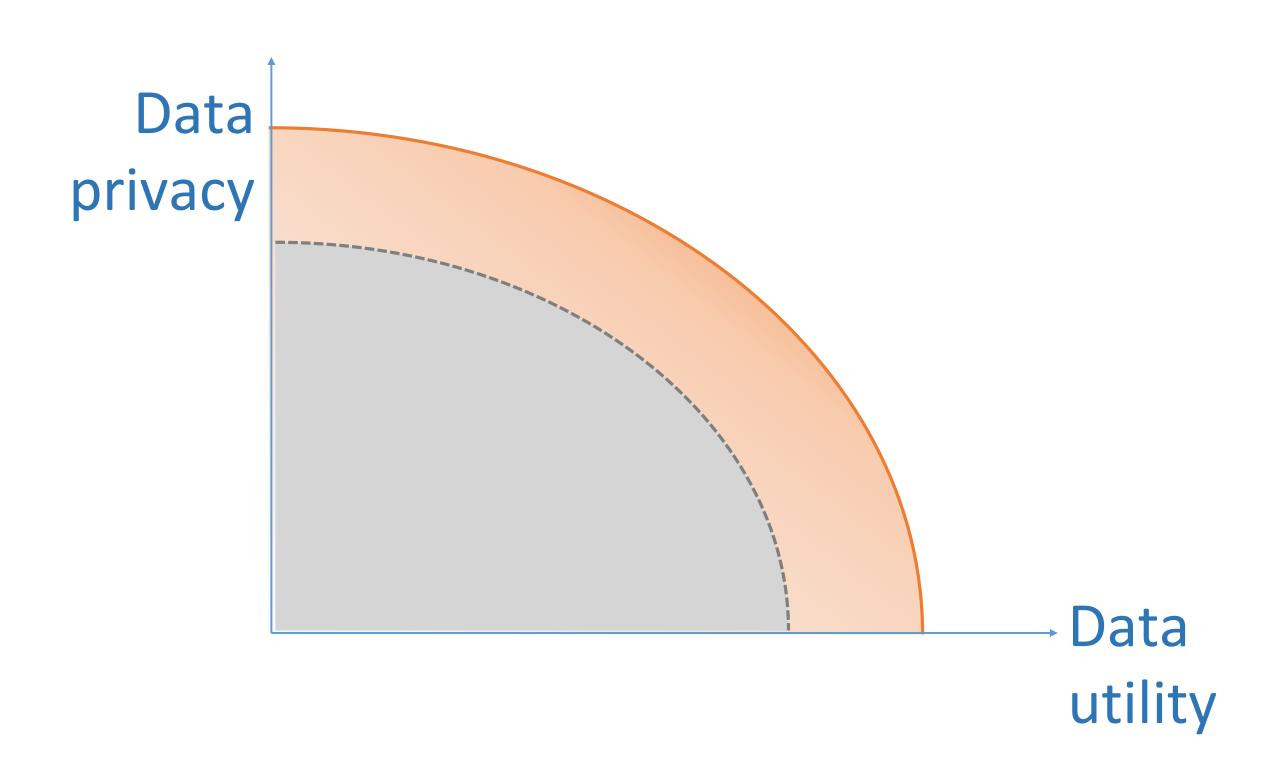




# 5. Final thoughts

### Benefit of cryptographically secure computation

- MPC says nothing about which data analyses are worthwhile to compute
- MPC de-couples discussion of what to compute from how to do so
- MPC expands the Pareto frontier of possible data analyses

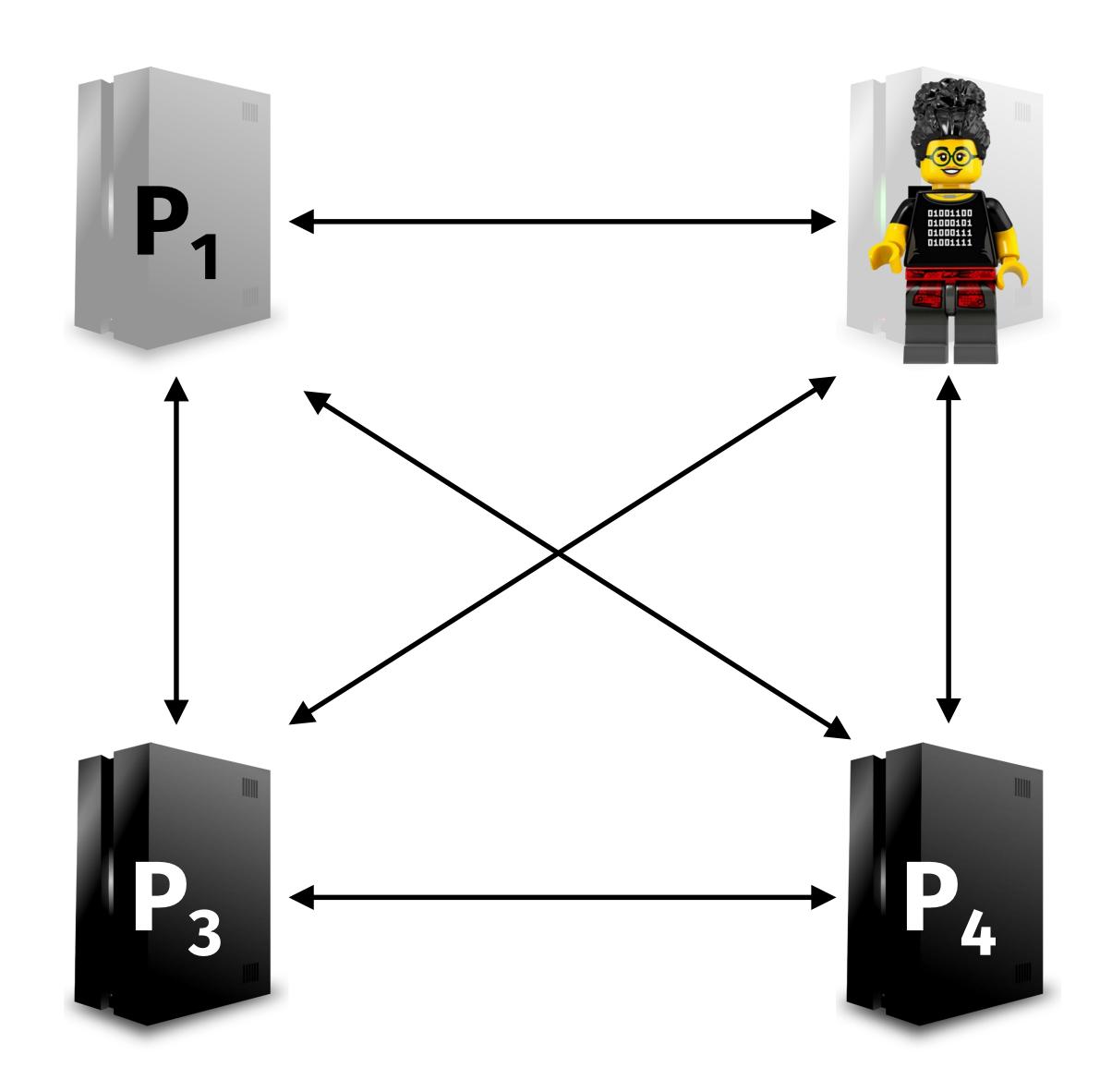


### Special case: zero-knowledge proofs

- Consider two parties: a prover P and a verifier V
- There is a public statement x that is claimed to be in an NP language L, and the prover knows a witness w such that R(x, w) = True
- P wants to convince V that  $x \in L$ , but without revealing w
- Prover and verifier can execute a 2-party secure computation of R

### Zero knowledge via "MPC in the head"

- P wants to convince V that x ∈ L, but without revealing w
- Prover securely computes R(x,w)
  - Prover acts as all compute parties
- Let the verifier choose t parties and receive their complete state
  - Privacy: observing the view of t parties gives V no information
  - Accuracy: if P deviates from the protocol, Pr[V catches] = t/n



# Next week: securely computing specific functions