# Secure Multi-Party Computation

Yanheng Wang

## Table of contents

1	Preliminaries	2
	1.1 Goals	2 2
	1.3 Lagrange interpolation	3
<b>2</b>	Passive MPC	4
	2.1 Shamir sharing2.2 Computation2.3 Passive security	$4 \\ 5 \\ 7$
3	Broadcast and Consensus	8
	3.1 Without setup	8 10
4	Active MPC	12
	4.1Commitment Function4.2Committed sharing4.3State tracking4.4Strengthening*	12 13 14 16
5	Efficiency	17
	5.1 Hyperinvertible map5.2 Faster passive MPC5.3 Faster active MPC	17 18 18
6	Asynchronous Broadcast and Consensus	22
	<ul> <li>6.1 The asynchronous model</li></ul>	22 22 23 25
7	Asynchronous MPC	27
	<ul> <li>7.1 A new distribution protocol</li> <li>7.2 Finding core set</li> <li>7.3 A new refill protocol</li> <li>7.4 Debate of the model</li> </ul>	27 28 29 29

## 1 Preliminaries

#### 1.1 Goals

Suppose n players  $\{1, \ldots, n\}$  live in a network where every pair can communicate directly. Each player *i* holds a private input  $x_i \in \mathbb{F}$  at the outset. The players cooperate in a protocol that computes  $y := \varphi(x_1, \ldots, x_n)$  for a prescribed function  $\varphi : \mathbb{F}^n \to \mathbb{F}$ . The setting is called *multi-party computation*, or MPC for short.

Sounds trivial, isn't it? Yes, now comes the complication: some players in the game may be malicious. Our goal is to design protocols that resist different levels of misbehaviours:

- Passive attack. An evil agency spies on a set of unconscious players  $C \subset \{1, \ldots, n\}$ . It acquires all information they have: their inputs  $\{x_i\}_{i \in C}$ , the final value y, and any intermediate result that they saw during execution. The first two types of leakage are uncontrollable anyway. But we hope that the third type – the intermediate results – do not reveal information beyond what can be inferred from  $\{x_i\}_{i \in C}$  and y. Namely, our protocol does its best to safeguard privacy of the other players.
- Active attack. The evil agency not only monitors the states of players  $C \subset \{1, \ldots, n\}$ , but also controls these puppets to deviate from the protocol.<sup>1</sup> For example, when the protocol instructs "everyone send his value to others", a player in C may withhold it or send inconsistent/wrong values to others. Our protocol should be robust enough to detect or even counter the effect, and strive for correctness and privacy.

Henceforth we call C the "cheaters" and  $D := \{1, ..., n\} \setminus C$  the "defenders". Such distinction is for analyses only; we don't know a priori which players are cheating. In the notes we will construct protocols that are passive/active secure against any  $C \subset \{1, ..., n\} : |C| \leq t$ , where the constant t is the "cheating level" we could tolerate (typically n/3).

Until the final sections, we always assume a *synchronous* infrastructure. That is, all players share a clock and proceed in rounds, and all sent messages arrive instantly.

#### **1.2** Polynomials

Polynomials are indispensable in constructing secure protocols. For our purpose we always assume a field  $\mathbb{F} := \mathbb{Z}_p$  for some prime  $p \gg n$ . A function  $f: \mathbb{F} \to \mathbb{F}$  is a *polynomial* if

$$f(x) = \sum_{i=0}^{d} \alpha_i x^i$$
 for some  $\alpha_1, \dots, \alpha_d \in \mathbb{F}$  where  $d < p$ .

*Remark* 1. Our "polynomial" is called "polynomial function" in standard literature, due to some subtlety that we will not encounter in the notes.

Is it possible that we can expand a polynomial in multiple ways? The following discussions exclude this possibility.

**Lemma 2.** Let f be a polynomial that can be expanded as  $f(x) = \sum_{i=0}^{d} \alpha_i x^i$  with  $\alpha_d \neq 0$ . Then f has at most d roots. In particular  $f \neq 0$  because d < p.

*Proof.* By induction on d. For d = 0, clearly  $f \equiv \alpha_0 \neq 0$  has no root. For  $d \ge 1$ , let  $x^*$  be a root if there is any. Using Euclidean division, we can find  $f(x) = (x - x^*) \cdot q(x) + r$  where  $r \in \mathbb{F}$  and  $q(x) = \sum_{i=0}^{d-1} \beta_i x^i$  with  $\beta_{d-1} \neq 0$ . Plugging in  $x = x^*$  we see r = 0, thus  $f(x) = (x - x^*) \cdot q(x)$ . By induction hypothesis q has at most d-1 roots, so f has at most d roots.

<sup>1.</sup> The "evil agency" need not be mankind. It can also model the unpredictable nature, e.g. system failure and communication error.

**Corollary 3.** Every polynomial  $f \neq 0$  has unique expansion  $f(x) = \sum_{i=0}^{d} \alpha_i x^i$  with  $\alpha_d \neq 0$ .

*Proof.* Suppose  $\sum_{i=0}^{d} \alpha_i x^i = f(x) = \sum_{i=0}^{e} \beta_i x^i$  where  $d \leq e < p$ . We agree that  $\alpha_i := 0$  for all  $d < i \leq e$  and consider

$$0 \equiv \sum_{i=0}^{e} (\beta_i - \alpha_i) x^i =: g(x)$$

By Lemma 2, this is impossible unless  $\beta_i = \alpha_i$  for all *i*.

With this result, we can now safely identify a polynomial  $f \not\equiv 0$  with its unique expansion coefficients  $(\alpha_1, \ldots, \alpha_d)$  where  $\alpha_d \neq 0$ . The integer d is called the *degree* of f and denoted as deg(f). As a convention, deg $(0) := -\infty$ .

This encoding allows us to sample a polynomial of degree  $\leq d$  uniformly at random: It suffices to sample the coefficients  $(\alpha_1, \ldots, \alpha_d) \in \mathbb{F}^d$  uniformly.

#### **1.3 Lagrange interpolation**

**Definition 4.** For a function  $g: L \to \mathbb{F}$  where  $L \subseteq \mathbb{F}$ , we define its Lagrange interpolation as

$$\Lambda_g(x) := \sum_{\ell \in L} g(\ell) \cdot \frac{\Delta_{L-\ell}(x)}{\Delta_{L-\ell}(\ell)} \quad \text{where} \quad \Delta_{L-\ell}(x) := \prod_{\ell' \in L \setminus \{\ell\}} (x - \ell').$$

By definition  $\Delta_{L-\ell}$  is a polynomial of degree  $\leq |L| - 1$ . Moreover,

$$\Delta_{L-\ell}(x) \begin{cases} =0 & \text{if } x \in L \setminus \{\ell\}, \\ \neq 0 & \text{if } x = \ell. \end{cases}$$

Therefore  $\Lambda_g$  is a polynomial of degree  $\leq |L| - 1$ , and for all  $x \in L$  we have  $\Lambda_g(x) = g(x)$ .

**Lemma 5.** Let f be any polynomial of degree d, and  $L \subseteq \mathbb{F}$  be any set with  $|L| \ge d+1$ . Then  $f \equiv \Lambda_{f|L}$  where f|L denotes the restriction of f on L.

*Proof.* Note that  $\Lambda_{f|L}(x) = f(x)$  for all  $x \in L$ . That is,

$$(f - \Lambda_{f|L})(x) = 0, \quad \forall x \in L.$$

Recall that  $\deg(f) = d$  and  $\deg(\Lambda_{f|L}) \leq |L| - 1$ . So the polynomial  $f - \Lambda_{f|L}$  has degree at most max  $\{d, |L| - 1\} = |L| - 1$ . But we have already found |L| roots. So by Lemma 2, this polynomial must be constantly zero, hence  $f \equiv \Lambda_{f|L}$ .

Lemma 5 gives us a another encoding of a degree-d polynomial: just take arbitrary d+1 (or more) evaluations of the polynomial. The exercise below offers another persepective.

**Exercise 1.** Given evaluations of a degree-d polynomial f at d+1 points, find a formula for the coefficients of f. (*Hint: use Vandemonde matrix.*)

We could already mention how Lagrange interpolation plays a role in secure protocols. A player can represent his secret by a polynomial f of degree t and distribute its evaluations to others. Each player holds only one evaluation, which is insufficient to recover f. On the other hand, if  $\ge t + 1$  players meet together, they can apply Lemma 5 to assemble f.

### 2 Passive MPC

Now we embark on the journey to MPC protocols. This section is devoted to a short and elegant protocol that resists passive cheaters. Recall that passive cheaters can pool their information together, but will not actively deviate from the protocol.

#### 2.1 Shamir sharing

The Shamir sharing realises the idea that we introduced in Section 1.3. When a player wants to share a secret s with others, he chooses a polynomial f such that  $\deg(f) \leq t$  and f(0) = s. That is, he "hides" the secret in the 0-slot of the polynomial. Then he distributes the evaluation f(i) to player i, for i = 1, ..., n. Each player now holds a small piece or "share". The shares together determine the secret (in fact,  $\geq t+1$  shares would already do), but knowing only  $\leq t$  of them is insufficient.

For perfect security, f must be chosen at random. To be precise we denote  $F_d(s) := \{f: \deg(f) \leq d, f(0) = s\}$ . When a player shares s, he should draw a fresh f uniformly from  $F_t(s)$ . This can be implemented by generating its coefficients  $(\alpha_0, \alpha_1, \ldots, \alpha_t) \in \{s\} \times \mathbb{F}^t$  uniformly.

Protocol Sha	MIR-DISTRIBUTE
--------------	----------------

**goal:** player k distributes shares of secret s to others

the distributer keach player isample  $f \in F_t(s)$  uniformlyeach player isend  $s_i := f(i)$  to each player ireceive my share

Protocol Shamir-Assemble		
<b>premise:</b> every player holds a share of the same secret $s$ <b>goal:</b> player $k$ collects the shares and assembles $s$		
the assembler $k$	each player $i$	
receive $s_1, \ldots, s_n$	send my share to $k$	
define function $g: i \mapsto s_i$		
$s := \Lambda_g(0)$		

It's important to understand that SHAMIR-DISTRIBUTE transforms the secret s into a vector  $s = (s_1, \ldots, s_n)$  scattered over all players. Any individual i holds the *i*-th component  $s_i$  only. But all players communally hold the whole vector and thus the secret.

**Lemma 6.** Any  $\leq t$  players together cannot gain any information about *s* from their shares. Formally, for all  $C \subset \{1, \ldots, n\}$  with  $|C| \leq t$ , the variables  $\{s_i\}_{i \in C}$  and *s* are independent. In information theory language, their mutual information is zero.

Proof. It suffices to condition on s and show that, for |C| = t, the variables  $\{s_i\}_{i \in C}$  are still uniform over  $\mathbb{F}^t$ . To this end, observe a bijection between  $f \in F_t(s)$  and  $\{s_i\}_{i \in C} \in \mathbb{F}^t$ . The forward map is "evaluating f at each  $i \in C$ ", and the reverse map is "Lagrange interpolating  $i \mapsto \begin{cases} s & i = 0 \\ s_i & i \in C \end{cases}$ ". Hence  $\{s_i\}_{i \in C}$  must be uniform over  $\mathbb{F}^t$  as we sample  $f \in F_t(s)$  uniformly.  $\Box$  A few more words to avoid misconception: When we later say "someone SHAMIR-DISTRIBUTE something", the someone isn't doing it alone. Instead, *all* players take part in the protocol where this someone acts as the distributer.

#### 2.2 Computation

Recall that the players want to compute  $y := \varphi(x_1, \ldots, x_n)$ . For convenience, the function  $\varphi$  is given as an arithmetic circuit consisting of three types of gates: addition, scaling, and multiplication. The gates are evaluated in a topological order. We do not need division gates because  $x^{-1} = x^{p-2}$  by Fermat's theorem and the latter can be computed via the well-known "square and multiply" method.

Example 7. The function  $\varphi(x_1, x_2, x_3) := 5 x_1 x_2 + (x_2 + x_3)^2$  can be given as



Now we outline the idea of the protocol. Basically, all computations are sandwiched between SHAMIR-DISTRIBUTE and SHAMIR-ASSEMBLE:

- One after one, every player SHAMIR-DISTRIBUTE his private input to others. Upon finish, everyone grabs a share of each other's input.
- Now they forget about the inputs and just work on the shares. Following an agreed topological order of the circuit, every individual directly operates the shares at hand (though as if manipulating meaningless random numbers!). But as we will show, this corresponds implicitly to operating the actual inputs.
- When the players finish the entire circuit, they SHAMIR-ASSEMBLE the final output.



Let's fix some shorthands.  $s \rightsquigarrow s$  indicates that the owner of s SHAMIR-DISTRIBUTE it as shares s. Conversely,  $s \nleftrightarrow s$  means that (say) player 1 SHAMIR-ASSEMBLE value s from shares s, and then notifies everyone of the value s.

The vector representation also allows us to describe local computations as vector operations. For example, a + b means that each player *i* locally adds the *i*-th components of a and b.



For the analysis, we identify a vector  $\boldsymbol{a} = (a_1, \ldots, a_n)$  with the natural mapping  $i \mapsto a_i$ . Hence  $\Lambda_{\boldsymbol{a}}$  means the Lagrange interpolation of  $i \mapsto a_i$ .

**Lemma 8.** For any vectors  $\boldsymbol{a} = (a_1, \ldots, a_n)$  and  $\boldsymbol{b} = (b_1, \ldots, b_n)$ ,

- $\Lambda_{a+b} = \Lambda_a + \Lambda_b$ .
- $\Lambda_{\lambda a} = \lambda \Lambda_a$ .
- $\Lambda_{a*b} = \Lambda_a \cdot \Lambda_b$  iff  $\deg(\Lambda_a) + \deg(\Lambda_b) < n$ .

*Proof.* Here we only show the first statement; the other two can be proved similarly. For all  $k \in \{1, ..., n\}$  we have  $\Lambda_{a+b}(k) = a_k + b_k = \Lambda_a(k) + \Lambda_b(k)$ . Since both sides have degree  $\leq n-1$  (recall the degree bound of Lagrange interpolation!) but we have found n agreements, the two polynomials must be equal by Lemma 2.

**Theorem 9.** Assume  $t := \lfloor (n-1)/2 \rfloor$ . Let  $\gamma \in \varphi$  be any gate. If the correct value of  $\gamma$  is v, and the protocol assigns a result v to it, then  $\Lambda_v \in F_t(v)$ .

*Proof.* By induction on the topological order of circuit  $\varphi$ . If  $\gamma$  is an input gate then the statement is trivially true. If  $\gamma$  is an arithmetic gate then we distinguish three types:

- Addition gate. Assume a, b are the correct values from the parents. By induction hypothesis we have  $\Lambda_{a} \in F_{t}(a)$  and  $\Lambda_{b} \in F_{t}(b)$ . By Lemma 8, we have  $\Lambda_{a+b} = \Lambda_{a} + \Lambda_{b} \in F_{t}(a+b)$ .
- Scaling gate. Similar.

PASSIVE MPC

• Multiplication gate. Again sssume a, b are the correct values from the parents. By hypothesis,  $\Lambda_a \in F_t(a)$  and  $\Lambda_b \in F_t(b)$ . By Lemma 8, we have  $\Lambda_c = \Lambda_a \cdot \Lambda_b \in F_{2t}(ab)$  because  $\deg(\Lambda_a) + \deg(\Lambda_b) \leq 2t < n$ . But the problem is that the degrees pile up. This is why the protocol does not take c as the result, for otherwise our induction cannot proceed. It circumvents the issue by a small trick. From  $\Lambda_c \in F_{2t}(ab)$  we see  $\Lambda_c(0) = ab$ . But on the other hand,

$$\Lambda_{c}(0) = \sum_{i=1}^{n} \frac{\Delta_{\{1,\ldots,n\}-i}(0)}{\Delta_{\{1,\ldots,n\}-i}(i)} c_{i}$$

by definition of Lagrange interpolation. Therefore,

$$ab = \sum_{i=1}^{n} \frac{\Delta_{\{1,\ldots,n\}-i}(0)}{\Delta_{\{1,\ldots,n\}-i}(i)} c_i$$

is a linear combination of the values  $\{c_i\}_{i=1}^n$ . Keep in mind that player *i* owns  $c_i$ . Security will break if he simply publishes this information. The trick is to wrap  $c_i$  by yet another Shamir sharing as the protocol does. Basically, we treat  $c_1, \ldots, c_n$  as private inputs and evaluate a linear combination of them. The problem then reduces to the addition/scaling cases, which we already handled. In the end we have

$$\Lambda_{\boldsymbol{d}} \in F_t \left( \sum_{i=1}^n \frac{\Delta_{\{1,\ldots,n\}-i}(0)}{\Delta_{\{1,\ldots,n\}-i}(i)} c_i \right) = F_t(ab).$$

**Corollary 10.** The protocol PASSIVE-MPC is correct.

#### 2.3 Passive security

You should have an intuition that the protocol PASSIVE-MPC resists passive attack. After all, the players always use fresh Shamir sharings to distribute their secrets, which leaks zero information by Lemma 6. This level of rigour is enough for us, but here we still provide a formalization that clarifies the meaning of security.

**Definition 11.** Let P be a protocol. Denote by  $\tau_i$  the set of variables that player i can see during its execution. We say P is *passively secure* with respect to C if there is an algorithm that

- takes  $\{x_i\}_{i \in C}$  and y as inputs; and
- generates a transcript that has the same distribution as  $\{\tau_i\}_{i \in C}$ .

We justify our definition as follows. Suppose the algorithm in the definition exists, then we can generate all intermediate results in  $\{\tau_i\}_{i\in C}$  blindly from  $\{x_i\}_{i\in C}$  and y, without even running the protocol. So anyone who tries to extract information from  $\{\tau_i\}_{i\in C}$  is not advantageous to a person who knows only  $\{x_i\}_{i\in C}$  and y. In other words, we cannot blame the protocol for leaking information.

**Exercise 2.** Prove that PASSIVE-MPC is passively secure with respect to any  $C \subset \{1, ..., n\}$  where  $|C| \leq t := \lfloor (n-1)/2 \rfloor$ .

**Exercise 3.** Consider an alternative subprotocol implementing the multiplication gates, and argue about its correctness and security:

Let a, b be the results from parents and compute c := a \* b. Each player *i* samples a secret random value  $r_i \in \mathbb{F}$  and distributes it twice:  $r_i \rightsquigarrow r_i$  and  $r_i \rightsquigarrow r_i^+$ . The second distribution is a bit special by using a polynomial of degree up to 2t (rather than the usual *t*). Compute  $\mathbf{r} := \sum_{i=1}^{n} \mathbf{r}_i$  and  $\mathbf{r}^+ := \sum_{i=1}^{n} \mathbf{r}_i^+$ . Compute  $\delta := c - r^+$  and immediately reconstruct  $\delta \rightsquigarrow \delta$ . Finally, take  $\mathbf{r} + (\delta, \dots, \delta)$  as the result.

## **3** Broadcast and Consensus

Before getting into actively secure MPC protocols we develop two key devices, *broadcast* and *consensus*. Even amid active cheaters, a broadcast protocol can deliver a consistent value from the broadcaster to the others, while a consensus protocol can strike an agreement among all defenders.

SPECIFICATION OF BROADCAST  $(\emptyset, \dots, \emptyset, x_k, \emptyset, \dots, \emptyset) \mapsto (y_1, \dots, y_n)$  **Consistent:**  $y_i = y_j$  for all  $i, j \in D$ . **Sound:** if  $k \in D$ , then  $y_i = x_k$  for all  $i \in D$ .

Specification of Consensus
$(x_1,\ldots,x_n)\mapsto(y_1,\ldots,y_n)$
<b>Consistent:</b> $y_i = y_j$ for all $i, j \in D$ .
<b>Persistent:</b> if $x_i = b$ for all $i \in D$ , then $y_i = b$ for all $i \in D$ .

Let's consider a super simple broadcast protocol: the broadcaster k just sends  $x_k$  to every player. Well, if  $k \in D$  then everything goes smoothly. But if  $k \in C$  then he can intentionally send different values to different players, leading to inconsistency. This should give you an idea why designing such protocols is non-trivial.

Lemma 12. One could use consensus to achieve broadcast, and vice versa.

*Proof.* Consensus  $\Rightarrow$  broadcast:

Protocol BROADCAST		
the broadcaster $k$	each player $i \neq k$	
send $x_k$ to all players		
	receive $x_k$ from $k$	
run Consensus	run Consensus	

Broadcast  $\Rightarrow$  consensus is an exercise, where we can only tolerate |(n-1)/2| cheaters.  $\Box$ 

#### 3.1 Without setup

In this section we design a consensus protocol that allows up to  $t := \lfloor (n-1)/3 \rfloor$  cheaters. For simplicity, we assume the inputs are 0/1. After understanding the proof, you are invited to extend the protocol to arbitrary field.

The protocol consists of multiple, cascading stages; each stage strengthens the output from the previous one. Ultimately the output is strong enough and meets our specification.

Protocol Consensus
for $k=1\ldots t+1$ do
run Weak-Consensus
run Graded-Consensus
run KING-CONSENSUS <sub>k</sub> where $k$ acts as king

• In WEAK-CONSENSUS stage, everybody exchange their preferences. A player adjusts his preference to  $b \in \{0, 1\}$  if he sees it trending *substantially*; otherwise he abtains. The idea is to play safe: follow the trend whenever possible; if the trend is unclear then step aside to avoid hindering the agreement.

- In GRADED-CONSENSUS stage, everybody exchange their (new) preferences. A player then adapts to the majority. In addition, he grades his decision as "strong" if the lead is substantial.
- In KING-CONSENSUS stage, a designated king gives an advisory value to others. A player ignores the advice if he already gained a "strong" belief in the previous stage; otherwise he takes the advice. In some sense, the king breaks ties and accelarates the formation of agreement.

The three stages are fleshed out below:

```
Protocol WEAK-CONSENSUSeach player i<br/>send my x_i to all players<br/>receive x_1, \ldots, x_n from all players<br/>let c_0 count the 0's among them<br/>let c_1 count the 1's among them<br/>adjustx_i := \begin{cases} 0 & c_0 \ge n-t \\ 1 & c_1 \ge n-t \\ \varnothing & \text{otherwise} \end{cases}Protocol GRADED-CONSENSUS
```

 $\begin{array}{l} \begin{array}{c} \textbf{each player } i \\ \hline \textbf{send my } x_i \text{ to all players} \\ \textbf{receive } x_1, \dots, x_n \text{ from all players} \\ \textbf{let } d_0 \text{ count the 0's among them} \\ \textbf{let } d_1 \text{ count the 1's among them} \\ \textbf{adjust } x_i := \mathbb{1}\{d_1 \ge d_0\} \\ \textbf{grade } \sigma_i := \mathbb{1}\{d_{x_i} \ge n - t\} \end{array}$ 

Protocol KING-CONSENSUS		
the king $k$	each player $i \neq k$	
send my $x_k$ to all players	receive $x_k$ from the king	
	if $\sigma_i = 0$ then adjust $x_i := x_k$	

Lemma 13. The protocol CONSENSUS is persistent.

*Proof.* Suppose  $x_i = b$  for all  $i \in D$ . We analyse the protocol in stages.

- In WEAK-CONSENSUS, every player receives at least  $|D| \ge n t$  copies of b. So any defender  $i \in D$  stays  $x_i = b$ .
- Then in GRADED-CONSENSUS, every player receives at least n-t copies of b, and at most t copies of  $\overline{b}$  (all sent by cheaters). Note that  $n-t \ge t$  by our choice of t. Therefore, any defender i shall stay  $x_i = b$  and grade himself  $\sigma_i = \mathbb{1}\{d_b \ge n-t\} = 1$ .
- Hence in KING-CONSENSUS, no defender shall listen to the word of the king. All of them insist on b.

• And the agreement b is preserved inductively throughout the loop. In the end, all defenders output b.

#### Lemma 14.

- 1. When WEAK-CONSENSUS finishes, if some defender  $i \in D$  holds value  $x_i = b \in \{0, 1\}$  then all defenders hold either b or  $\emptyset$ .
- 2. When GRADED-CONSENSUS finishes, if some defender  $i \in D$  holds value  $x_i = b$  and grade  $\sigma_i = 1$  then all defenders hold value b.
- 3. When KING-CONSENSUS<sub>k</sub> finishes, if  $k \in D$  holds  $x_k = b$  then all defenders hold value b.
- 4. The protocol CONSENSUS is consistent.

Proof.

- 1. Suppose  $i \in D$  holds  $x_i = b \in \{0, 1\}$ , thus he had received  $c_b \ge n t$  copies of b. Among them at most t copies came from cheaters, thus at least n 2t copies came from defenders. So at least n 2t defenders held b prior to this stage. It implies that all players shall receive  $\ge n 2t$  copies of b, and hence  $\le 2t < n t$  copies of  $\overline{b}$ . So no defender shall output  $\overline{b}$ .
- 2. Suppose  $i \in D$  holds  $x_i = b$  and  $\sigma_i = 1$ . From his perspective  $d_b \ge n t$ . Again, at least n 2t copies of b that he has received are reliable, so at least n 2t defenders held the value b. We make two parallel observations:
  - Any defender is able to count  $d_b \ge n 2t$ .
  - No defender held  $\bar{b}$  due to point 1. So any received  $\bar{b}$  must come from a cheater, thus  $d_{\bar{b}} \leq t$ .

Therefore  $d_b > d_{\bar{b}}$ , so any defender ends up with value b.

- 3. Suppose  $k \in D$  holds  $x_k = b$ . For any other defender  $i \in D$  we consider two cases.
  - If his grade is  $\sigma_i = 0$ , then he will take the king's value b.
  - If his grade is  $\sigma_i = 1$ , then he will insist on his own value  $x_i$ . But from point 2 we know that all defenders including the king held the same value prior to the current stage, thus  $x_i = x_k = b$ .
- 4. Since  $|C| \leq t$ , at least one of the t+1 rounds would designate a defender as the king. For that particular round we can achieve agreement among defenders, by point 3. From then on the agreement preserves by Lemma 13.

#### 3.2 With setup

In this section we describe a signature-based broadcast protocol that allows up to t := n - 1 cheaters. The superior bound comes at price:

- We have to introduce cryptographic assumptions (e.g. dlog, RSA) underlying the digital signature scheme.
- Also, the network must provide some public key infrastrutures for key delivery.
- With positive success probability, the cheaters can sabotage the protocol via breaking the signature scheme. The probability is negligible though, if the cheaters are polynomially bounded.

The basic idea of the protocol is simple: All players forward whatever new value(s) they received from others, so that everyone can observe inconsistency if there is any. In that case, they output some default value, say 0.

But be careful! We could not afford running a protocol indefinitely, so a maximum number of rounds, r, must be imposed. Now consider the following situation. All players follow the protocol in the first r-1 rounds perfectly and all see a consistent value, say 35. Until in the final round a cheater sends a defender i some new value, say 22. Even though i sees inconsistency, he has no more chance to inform others. So i outputs the default value 0 while all other defenders output 35.

This "last round" problem is resolved by a smart construction due to Dolev and Strong. Suppose each player *i* has a secret/public key pair  $(sk_i, pk_i)$ , where the public keys are accessible by everybody. Any value circulating in the network must be signed at each hop to track its history. It will be discarded if the history is incomplete. Hence a surviving value must have originated from the beginning and will have enough time to reach every defender.

Protocol Dolev-Strong
the broadcaster $k$
$\operatorname{sign} \sigma := \operatorname{sgn}(\operatorname{sk}_k, x_k)$
send $(x_k, \{\sigma\})$ to all players
then, each player $i$
for $r = 1 \dots t + 1$ do
receive $(x, \Sigma)$
if x not yet accepted, and $\Sigma$ contains valid signatures
from k and from $r-1$ other distinct players <b>then</b>
accept $x$
sign $\sigma := \operatorname{sgn}(\operatorname{sk}_i, x)$
send $(x, \Sigma \cup \{\sigma\})$ to all players
if have accepted exactly one $x$ then output $x$
<b>else</b> output default value 0

Lemma 15. The protocol DOLEV-STRONG is consistent and sound, provided that the signature scheme is unforgeable.

*Proof.* (Consistency) Consider any message  $(x, \Sigma)$  accepted by any defender  $i \in D$  in any round r.

- If r ≤ t is not the last round, then i is able to forward (x, Σ ∪ {σ}) in the next round. By then every defender will accept the value x.
- If r = t + 1 is the last round, then *i* cannot forward the value. Fortunately, since  $\Sigma$  in this case contains signatures from r = t + 1 > |C| distinct players<sup>2</sup>, at least one of them, say *j*, is a defender. This *j* had accepted the value *x* in some *previous* round and had already informed others. Therefore every defenders have accepted the value *x*.

Hence, whenever some defender accepts x, all defenders accept it too. So the defenders output consistently.

(Soundness) Exercise.

<sup>2.</sup> Here we used the unforgeability assumption. We observe r distinct *signatures*, but we conclude that there are r distinct *signers*. This makes sense only if the signatures are unforgeable.

## 4 Active MPC

In the active attack setting, cheaters can deviate from our protocol arbitrarily and mess it up. As protocol designers, we must build mechanism to detect and correct possible deviations. We let the players run our old PASSIVE-MPC protocol, but on top of that we ask them to monitor each other and raise a complaint when they observe misbehaviour. If player *i* blames player *j*, then one of them must be a cheater. To figure out who, *j* proves his innocence by showing a conclusive evidence. If *j* fails to do so then we eliminate him from the game; otherwise we eliminate *i*. The game is then restarted with one player less.

How can a player tell misbehaviour without knowing others' internal states? And, why can a defender present a proof of innocence, while a cheater cannot? The high level idea is as follows. Everybody encrypt his initial state and broadcast the cypher. Due to some structural property of our encryption scheme, calculus on the cyphers corresponds to calculus on the states behind the scenes. Therefore, every players can do cypher calculus in the public domain, which essentially "tracks" the state evolution of the protocol. At some point a player must "open" his current state to another player for verification. If it does not match the (publicly known) cypher, then something must be wrong.

The "encryption" here is more precisely called "commitment". We will next define its properties before we embed it into our protocol. Unless otherwise stated, we allow cheating level  $t := \lfloor (n-1)/3 \rfloor$ .

#### 4.1 Commitment Function

A commitment function  $H: (x, r) \mapsto \sigma$  locks value x into "commitment"  $\sigma$ , using a uniform random "key" r to protect x. We impose three semantic requirements:

- Binding: Given any (x, r), it is hard<sup>3</sup> to find  $x' \neq x$  and r' such that H(x', r') = H(x, r).
- *Hiding*: Given  $\sigma$ , it is hard to tell which value x gave rise to  $\sigma$ .

• Homomorphic: For all (x, r) and (x', r') we have  $H(x, r) \cdot H(x', r') = H(x + x', r + r')$ . The binding property implies impossibility to alter preimage – once you have committed to x and broadcast the commitment  $\sigma$ , you cannot lie when others request a proof. The hiding property means you can safely broadcast  $\sigma$ , as others cannot infer x from it. The homomorphic property says commitment calculus mirrors preimage calculus.

Remark 16. Sometimes we can impose even stronger properties. For instance, the "perfect binding" property requires that there is no  $x' \neq x$  and r' with H(x, r) = H(x', r'). The "perfect hiding" property requires that  $H(x, \cdot)$  is bijective for any x. In particular, provided that r is uniform,  $\sigma = H(x, r)$  always uniformly distributes over the entire space Im(H), regardless of the value x.

Below we collect two concrete commitment functions based on the discrete logarithm assumption.

Example 17. (Pederson) Let  $(\mathbb{G}, +)$  be a group of order p with generators g and h. We define  $H: \mathbb{Z}_p \times \mathbb{Z}_p \to \mathbb{G}$  by  $H(x, r) := g^x h^r$ . It is perfect hiding because h is a generator and thus  $H(x, \cdot)$  is bijective. It is binding because any algorithm spotting a collision  $g^x h^r = g^{x'} h^{r'}$  with  $x \neq x'$  can be transformed into an attacker for discrete logarithm problem (how?). Finally, it is homomorphic for obvious reason.

*Example* 18. (ElGammal) This is essentially Pederson commitment tagged with the key. That is, we define  $H: \mathbb{Z}_p \times \mathbb{Z}_p \to \mathbb{G}^2$  by  $H(x,r) := (g^x h^r, g^r)$ . It is hiding, perfectly binding, and homomorphic. The arguments are left as exercise.

<sup>3.</sup> As per cryptography convention, "hard" means that any polynomial time algorithm can only succeed with negligible probability.

Next we show the use case of a commitment function H. Notation:

- The symbol  $\asymp$  reads "tracks".
- " $\sigma \simeq (x, r)$ " indicates that all players had locally stored  $\sigma$ , which should equal H(x, r).
- The command "let  $\exp r \approx (x, r)$ " instructs all players to locally evaluate expression  $\exp r$  and store the result  $\sigma$ , which *should* equal H(x, r). Here  $\exp r$  shall involve public information only, so everyone can execute without trouble. Upon finish of the command, we have  $\sigma \approx (x, r)$ .

#### Protocol Lock

**goal:** all players learn the commitment by player k to his secret s

```
the owner keach playersample r uniformlyget \sigmabroadcast \sigma := H(x, r)get \sigmalet \sigma \asymp (x, r)
```

#### Protocol Open

premise:  $\sigma \asymp (x, r)$ goal: player *i* transfers (x, r) to player *j* <u>the owner *i*</u> <u>the receiver *j*</u> send (x, r) to *j* <u>receive</u> (x, r)if  $H(x, r) = \sigma$  then broadcast "valid" else broadcast "invalid" when hearing "invalid", <u>the owner *i*</u> <u>each player</u> broadcast (x, r) <u>each player</u> if  $H(x, r) = \sigma$  then eliminate player *j* and reset else eliminate player *i* and reset

## 4.2 Committed sharing

We are now ready to adapt Shamir sharing to the active setting, by adding commitments and verifications to the main skeleton.

Protocol Committed-Distribute		
<b>premise:</b> $\sigma_0 \asymp (s, \rho_0)$		
<u>the distributer k</u>	each player $i$	
sample $f \in F_t(s)$ uniformly		
expand $f(x) =: \sum_{j=0}^{t} \alpha_j x^j$		
for $j = 1t$ do	for $j=1\ldots t$ do	
lock $\alpha_j$ (key denoted $\rho_j$ )	$\sigma_j \! \asymp \! (lpha_j,  ho_j)$	
	let $\prod_{j=0}^{t} \sigma_j^{i^j} \approx (f(i), \sum_{j=0}^{t} \rho_j i^j)$	
open $(f(i), \sum_{j=0}^{t} \rho_j i^j)$ to each i	get valid $(s_i, r_i)$	
у °	keep $(s_i,r_i)$ as my share/key	

Essentially, the distributer hands out the (encrypted) coefficients (including the secret), allowing the *public* to virtually construct the polynomial. Then he opens the respective share to each player, who can readily tell if he is deviating from *that* polynomial. This way, the shares of the players indeed lie on the same polynomial  $f \in F_t(s)$ , although f might not be random if  $k \in C$ .

Protocol COMMITTED-ASSEMBLEpremise:  $\sigma_i \asymp (s_i, r_i)$  for i = 1, ..., nthe assembler kreceive  $(s_1, r_1), ..., (s_n, r_n)$ each player isend my share/key  $(s_i, r_i)$  to kexclude indices  $i: H(s_i, r_i) \neq \sigma_i$ define function  $g: i \mapsto s_i$  $s:= \Lambda_g(0)$ 

#### 4.3 State tracking

- $s \rightsquigarrow (s, r)$  means that the players run COMMITTED-DISTRIBUTE. When they finish, the owner of s has distributed the shares s along with keys r. As before s and r are vectors; player i knows i-th component only.
- $s \leftrightarrow (s, r)$  means that the players assemble s by running COMMITTED-ASSEMBLE where k = 1, ..., n take turns as the assembler. Note that it is improper to assemble centrally and then broadcast, as the broadcaster might alter the value that he learns.
- " $\sigma \asymp (s, r)$ " and "let  $\exp r \asymp (s, r)$ " should be interpreted coordinatewise.

```
Protocol ACTIVE-MPC
for i = 1...n do
        let \gamma be the input gate for player i
        player i locks x_i
        x_i \rightsquigarrow (\gamma . \boldsymbol{s}, \gamma . \boldsymbol{r})
foreach gate \gamma in circuit \varphi
        let \mu and \nu be the parents of \gamma
        \boldsymbol{\sigma} \simeq (\mu . \boldsymbol{s}, \mu . \boldsymbol{r})
        \boldsymbol{\pi} \simeq (\nu . \boldsymbol{s}, \nu . \boldsymbol{r})
        case \gamma is an addition gate
                \gamma.\boldsymbol{s} := \mu.\boldsymbol{s} + \nu.\boldsymbol{s}
                 \gamma.\boldsymbol{r} := \mu.\boldsymbol{r} + \nu.\boldsymbol{r}
                let \boldsymbol{\sigma} * \boldsymbol{\pi} \asymp (\gamma . \boldsymbol{s}, \gamma . \boldsymbol{r})
        case \gamma is a multiplication gate
                 \boldsymbol{c} = (c_1, \ldots, c_n) := \mu \cdot \boldsymbol{s} * \nu \cdot \boldsymbol{s}
                 for i = 1 \dots n do
                         player i locks c_i
                         player i proves c_i = a_i \cdot b_i
                         c_i \rightsquigarrow (\boldsymbol{c}_i, \boldsymbol{r}_i)
                         \eta_i 
ightarrow (c_i, r_i)
                \gamma.\boldsymbol{s} := \sum_{i=1}^{n} w_i \boldsymbol{c}_i\gamma.\boldsymbol{r} := \sum_{i=1}^{n} w_i \boldsymbol{r}_i
                let \prod_{i=1}^{n} \eta_i^{w_i} \asymp (\gamma.s, \gamma.r)
let \gamma be the final gate
y \nleftrightarrow (\gamma . \boldsymbol{s}, \gamma . \boldsymbol{r})
```

For brevity, in the protocol we omitted the scaling gates, and abbreviated

$$w_i := \frac{\Delta_{\{1,\ldots,n\}-i}(0)}{\Delta_{\{1,\ldots,n\}-i}(i)}$$

In the case of addition gates, the players locally add the shares (like before) as well as the associated keys. At the same time, the public multiply the commitments accordingly to track the change by homomorphism.

In the case of multiplication gates, the idea is the same except for one more technicality: There is no apparent way to derive a commitment to  $c_i$  from what the public already knows (e.g. the commitments to  $a_i$  and  $b_i$ ). Homomorphism just doesn't apply. Hence, as the protocol does, player *i* has to establish a *fresh* commitment to  $c_i$  that has no connection to prior public knowledge. How can we bridge the gap? Here a MULTIPLICATION-PROVE is invoked to convince other players that *i* did the multiplication properly. The protocol is based on polynomials too, but in a special way.

Protocol MULTIPLICATION-PROVE		
<b>premise:</b> the prover k locked $v, v', v''$ and $\sigma_0 \asymp (v, \rho_0)$ <b>goal:</b> he convinces others that $v = v' \cdot v''$		
$v' \rightsquigarrow (v', r')$ ; denote the chosen polynomial $f'$ ; discard keys		
$v'' \rightsquigarrow (\boldsymbol{v}'', \boldsymbol{r}'');$ denote	the chosen polynomial $f''$ ; discard keys	
the prover $k$	each player $i$	
$\overline{f := f' \cdot f''}$		
expand $f(x) =: \sum_{j=0}^{2t} f(x)$	$lpha_j x^j$	
for $j = 12t$ do for $j = 12t$ do		
lock $\alpha_j$ (key denoted $\rho_j$ ) $\sigma_j \asymp (\alpha_j, \rho_j)$		
let $\prod_{j=0}^{2t} \sigma_j^{i^j} \asymp (f(i), \sum_{j=0}^{2t} \rho_j i^j)$		
open $(f(i), \sum_{j=0}^{2t} \rho_j i^j)$ to each <i>i</i> get valid $(f(i), r_i)$		
	if $f(i) = v'_i \cdot v''_i$ then broadcast "match" else broadcast "mismatch"	
when hearing "misr	natch" from player <i>i</i> ,	
the prover $k$ each player		
$\overline{\text{broadcast}(f(i),r)}  \overline{\blacktriangleright(f(i),r)}$		
if $H(f(i),r) = \prod_{j=0}^{2t} \sigma_j^{i^j}$ then		
eliminate player $i$ and reset		
else		
eliminate player $k$ and reset		
discard everything generated in this protocol		

We remind the readers, that the first two steps implicitly use the commitments to v' and v'' given by the premise.

Suppose the prover lies (i.e. locked v, v', v'' such that  $v \neq v' \cdot v''$ ). From the viewpoint of the public, they (virtually) constructed polynomials f, f', f'' where  $\deg(f'), \deg(f'') \leq t$ ,  $\deg(f) \leq 2t$ , and moreover  $f(0) = v \neq v' \cdot v'' = f'(0) \cdot f''(0)$ . Since the different polynomials f and  $f' \cdot f''$  can agree on at most 2t evaluations, there are at least  $n - 2t > t \geq |C|$ mismatches. So at least one defender shall notice and broadcast "mismatch", eliminating the prover.

#### 4.4 Strengthening\*

Due to limitation of our current multiplication proof, we can tolerates up to  $t = \lfloor (n-1)/3 \rfloor$  cheaters. Using the theory of zero knowledge proofs, it is possible to allow up to  $t = \lfloor (n-1)/2 \rfloor$  cheaters, but we will not pursue that direction in the notes.

For another direction of strengthening, we may replace the commitment function by a *interactive commitment scheme* that does not inherit any cryptographic assumption. In the scheme, the commitment is no longer a single value  $\sigma$ , but a vector  $\boldsymbol{\sigma}$  scattered over the players. Also, the key is not a scalar but a polynomial. (Though methodologically similar to Shamir sharing, we must distinguish them as they have different purposes!)

To LOCK value s into commitment  $\boldsymbol{\sigma}$ , the owner sends each player a slice of a bivariate polynomial going through (0,0,s). The players exchange limited amount of information to check consistency and complain if not. After resolving all complaints, player *i* projects his slice to a number  $\sigma_i$ . The values  $(\sigma_1, \ldots, \sigma_n) =: \boldsymbol{\sigma}$  jointly serve as the commitment. One can show that  $\{(i, \sigma_i)\}_{i \in D}$  lie on polynomial  $r \in F_t(s)$ , which is used as the owner's key.

To OPEN the value to player j, the owner simply transmits j the key r (a polynomial). Then j collects the scattered  $\sigma$  from all players and checks if they lie on r. He accepts iff there are  $\leq t$  outliers. Clearly, if the owner is honest then j shall accept. If the owner is cheating, then his transmitted key  $r \neq \Lambda_{(i \in D) \mapsto \sigma_i}$ . The two polynomials have at most t intersections and will disagree on >2t points (>t came from defenders), so j shall reject.

The scheme has the attractive feature of being perfect hiding, perfect binding and homomorphic all at once. It lifts the entire protocol to information-theoretical security, i.e. resisting  $t = \lfloor (n-1)/3 \rfloor$  cheaters of *unbounded* resources.

## 5 Efficiency

Multiplication gate is the performance bottleneck in our protocols.

- In PASSIVE-MPC, each multiplication gate needs a fresh SHAMIR-DISTRIBUTE, which communicates  $n^2$  messages.
- In ACTIVE-MPC, each multiplication gate invokes a fresh COMMITTED-DISTRIBUTE and *n* MULTIPLICATION-PROVE. Each of these needs  $\Theta(n)$  LOCK. Each LOCK requires one broadcast, which in turn entails  $\Theta(t \cdot n^2) = \Theta(n^3)$  messages. In total, a multiplication gate amounts to  $\Theta(n^5)$  messages!

Can we do better? Surprisingly, we could compress the message complexity of a multiplication gate to amortized  $\Theta(n)$  in both passive and active protocols!

Let us begin with the passive setting. Recall the alternative multiplication scheme that we saw in Exercise 3:

Let  $\boldsymbol{a}, \boldsymbol{b}$  be the results from parents and compute  $\boldsymbol{c} := \boldsymbol{a} * \boldsymbol{b}$ . Each player i samples a secret random value  $r_i \in \mathbb{F}$  and distributes it twice:  $r_i \rightsquigarrow \boldsymbol{r}_i$  and  $r_i \rightsquigarrow \boldsymbol{r}_i^+$ . The second distribution is a bit special by using a polynomial of degree up to 2t (rather than the usual t). Compute  $\boldsymbol{r} := \sum_{i=1}^n \boldsymbol{r}_i$  and  $\boldsymbol{r}^+ := \sum_{i=1}^n \boldsymbol{r}_i^+$ . Compute  $\boldsymbol{\delta} := \boldsymbol{c} - \boldsymbol{r}^+$  and immediately reconstruct  $\boldsymbol{\delta} \leftrightarrow \boldsymbol{\delta}$ . Finally, take  $\boldsymbol{r} + (\boldsymbol{\delta}, \ldots, \boldsymbol{\delta})$  as the result.

Basically, each player contributes a random  $r_i$  to the "secure randomness"  $r := \sum_{i=1}^{n} r_i$  whose distribution is guaranteed uniform. (In fact, summing t + 1 individual randomness suffices.) The message complexity is again  $\Theta(n^2)$ .

To reduce cost, can we extract from  $r_1, \ldots, r_n$  multiple secure randomness and save the excess for future use? If we manage to extract  $\Theta(n)$  many, then the amortized complexity becomes  $\Theta(n^2/n) = \Theta(n)$ . This idea is implemented by a structure called hyperinvertible map.

#### 5.1 Hyperinvertible map

**Definition 19.** Assume  $\Psi: (y_1, \ldots, y_n) \mapsto (y_{n+1}, \ldots, y_{n+m})$  maps from  $\mathbb{F}^n$  to  $\mathbb{F}^m$ . If for all  $I \subset \{1, \ldots, n+m\}$  of size |I| = n and all assignments to  $\{y_i\}_{i \in I}$ , there is a unique assignment to  $\{y_i\}_{i \notin I}$  satisfying  $\Psi(y_1, \ldots, y_n) = (y_{n+1}, \ldots, y_{n+m})$ , then we call  $\Psi$  hyperinvertible.

In other words,  $\Psi$  is hyperinvertible if fixing in total *n* values (inputs and/or outputs) would uniquely determine the remaining values. Such property reminds us of polynomial evaluation and interpolation. For example, the map

$$\Psi(y_1,\ldots,y_n) := (g(n+1),\ldots,g(n+m)) \quad \text{where} \quad g := \Lambda_{(y_1,\ldots,y_n)}$$

is hyperinvertible. To see this, notice that  $\Psi(y_1, \ldots, y_n) = (y_{n+1}, \ldots, y_{n+m})$  if and only if points  $(1, y_1), \ldots, (n+q, y_{n+m})$  lie on a polynomial of degree  $\leq n-1$ . (Prove it!) Hence, fixing any *n* values would uniquely determine the other values. Moreover the map is linear.

**Lemma 20.** Let  $\Psi: \mathbb{F}^n \to \mathbb{F}^m$  be a hyperinvertible map where  $n \ge m$ . Then no matter how we fix n - m many inputs, the restricted map is a bijection  $\mathbb{F}^m \to \mathbb{F}^m$ .

Proof. Denote  $\Psi: (y_1, \ldots, y_n) \mapsto (y_{n+1}, \ldots, y_{n+m})$ . Fix any  $I_0 \subset \{1, \ldots, n\}$  with  $|I_0| = n - m$ and impose any condition on inputs  $\{y_i\}_{i \in I_0}$ . They together with the outputs uniquely determine all other inputs, establishing an inverse mapping from  $\{y_i\}_{i \in \{n+1,\ldots,n+m\}}$  to  $\{y_i\}_{i \in \{1,\ldots,n\} \setminus I_0}$ . Hence the restricted map is bijective.  $\Box$ 

#### 5.2 Faster passive MPC

Let  $\Psi: \mathbb{F}^n \to \mathbb{F}^{n-t}$  be a linear hyperinvertible map. We apply it on individual randomness  $r_1, \ldots, r_n$  from the players. Among these at most t are cheating, but Lemma 20 ensures a bijection from the remaining (i.e. good) inputs and the outputs. Since the good inputs are uniformly distributed over  $\mathbb{F}^{n-t}$ , the outputs must also be uniform over  $\mathbb{F}^{n-t}$ . In other words, we can extract n-t secure randomness out from  $r_1, \ldots, r_n$ .

Protocol REFILL		
for $i=1\ldots n$ do		
player $i$ samples $r_i$ uniformly		
$r_i \rightsquigarrow r_i$ using degree up to t		
$r_i \sim r_i^+$ using degree up to $2t$		
$(oldsymbol{ ho}_1,\ldots,oldsymbol{ ho}_{n-t}):=\Psi(oldsymbol{r}_1,\ldots,oldsymbol{r}_n)$		
$(m{ ho}_1^+,\ldots,m{ ho}_{n-t}^+)\!:=\!\Psi(m{r}_1^+,\ldots,m{r}_n^+)$		
keep random pairs $(\boldsymbol{\rho}_1, \boldsymbol{\rho}_1^+), \ldots, (\boldsymbol{\rho}_{n-t}, \boldsymbol{\rho}_{n-t}^+)$ for future use		

The line  $(\rho_1, \ldots, \rho_{n-t}) := \Psi(r_1, \ldots, r_n)$ , for example, means that each player *i* locally computes  $(\rho_{1i}, \ldots, \rho_{n-t,i}) := \Psi(r_{1i}, \ldots, r_{ni})$ . Here *linearity* of  $\Psi$  is crucial, because otherwise we will lose the connection between local computation on the shares and the conceptual computation on the randomness.

Following the lines, a faster passive MPC protocol is immediate:

```
Protocol PASSIVE-MPC

...

foreach gate \gamma in circuit \varphi

...

case \gamma is a multiplication gate

assume a, b the results from parents

compute a * b =: c = (c_1, \dots, c_n)

if randomness depleted then

REFILL

take the next randomness pair (\rho, \rho^+)

\delta := c - \rho^+

\delta \leftrightarrow \delta

take \rho + (\delta, \dots, \delta) as the result of \gamma

...
```

#### 5.3 Faster active MPC

The protocol REFILL does not work in the active setting: a cheater  $i \in C$  might distribute  $r_i$ and/or  $r_i^+$  via polynomials of wrong degree, or introduce inconsistencies between the two. We amend the protocol with a checking phase. Let  $\Psi \colon \mathbb{F}^n \to \mathbb{F}^n$  be a linear hyperinvertible map. Protocol RELIABLE-REFILL for i = 1...n do player i samples  $r_i$  uniformly  $r_i \rightsquigarrow r_i$  using degree up to t  $r_i \rightsquigarrow r_i^+$  using degree up to 2t  $(\boldsymbol{\rho}_1, ..., \boldsymbol{\rho}_n) := \Psi(\boldsymbol{r}_1, ..., \boldsymbol{r}_n)$   $(\boldsymbol{\rho}_1^+, ..., \boldsymbol{\rho}_n^+) := \Psi(\boldsymbol{r}_1^+, ..., \boldsymbol{r}_n^+)$ for i = 1...2t do player i collects  $\boldsymbol{\rho}_i$  from others and interpolates  $f := \Lambda_{\boldsymbol{\rho}_i}$ player i collects  $\boldsymbol{\rho}_i^+$  from others and interpolates  $g := \Lambda_{\boldsymbol{\rho}_i^+}$ abort if player i claims  $(\deg(f) > t) \lor (\deg(g) > 2t) \lor (f(0) \neq g(0))$ keep randomness  $(\boldsymbol{\rho}_{2t+1}, \boldsymbol{\rho}_{2t+1}^+), \ldots, (\boldsymbol{\rho}_n, \boldsymbol{\rho}_n^+)$  for future use

Simply put, we "reveal" 2t randomness to different checkers. Among them at least 2t - t = t are defenders, who will check faithfully. If no one claims abnormality, then we have at least t tame outputs (the word "tame" only means correct degree and consistency; it does not imply correct distribution). They and the at least n - t tame inputs linearly determine the rest of inputs/outputs by  $\Psi$ . So we must conclude that *all* inputs/outputs are tame.

Having passed this syntactic check, the situation degenerates to the passive case. So we may now conclude, semantically, that the unrevealed n - 2t randomness are uniformly distributed and serve as the desired secure randomness.

Next we explain secret distribution. The key idea is to mask the secret by a secure randomness and broadcast the result. All other players can then undo the mask locally.

Protocol Reliable-Distribute		
<b>premise:</b> the next available randomness pair is $(\rho, \rho^+)$ goal: k distributes the shares of secret s; they do lie on a degree-t polynomial		
the distributer $k$	each player $i$	
receive $\rho_1, \ldots, \rho_n$ find $f: \deg(f) \leq t$ with $ \{i: f(i) = \rho_i\}  > 2t$ $\rho := f(0)$	send my randomness share $\rho_i$ to $k$	
broadcast $\delta := s - \rho$	receive $\delta$ compute my share as $s_i := \rho_i + \delta$	

In the first half (highlighted in yellow), k collects  $\rho = (\rho_1, \ldots, \rho_n)$  and reconstructs the secure randomness  $\rho$ . Of course, any cheater can send an incorrect share; but we still have  $|D| \ge n - t > 2t$  unaltered shares – which lie on a degree t polynomial by guarantee of RELIABLE-REFILL. So the desired f always exists. On the other hand, if some f satisfies the condition, then >2t - t = t shares lying on it came from defenders, which enforces f to coincide with the correct polynomial. In summary, the first phase can always figure out the right  $\rho$ .

In the second half, the distributer masks his secret by  $\rho$  and broadcasts it. This does not expose any secret since  $\rho$  is random. Each player then locally removes the mask and obtain a share for s. Note that the shares  $\mathbf{s} = (s_1, \ldots, s_n)$  inherits the degree from the shares  $\boldsymbol{\rho} = (\rho_1, \ldots, \rho_n)$ , which is by assumption correct. Remark 21. The search for f can be implemented efficiently by Berlekamp-Welch decoder. One can regard it as a robust version of Lagrange interpolation in SHAMIR-ASSEMBLE that resists up to t outliers. This unveils curious connections to coding theory and, indeed, the trick was inspired by error correction codes.

The final missing piece, RELIABLE-ASSEMBLE, is in charge of reconstructing secrets from shares. What could be simpler? Just Berlekamp-Welch decodes the secret towards each player!

But there is space for improvement. The following protocol allows us to assemble multiple (up to  $n - 2t = \Theta(n)$ ) secrets in one batch for the sake of efficiency.

#### Protocol Reliable-Assemble

**premise:**  $\ell + 1$  secrets  $s^{(0)}, \ldots, s^{(\ell)}$ , each shared by degree-*d* polynomial **goal:** all players learn all these secrets

for i = 1...n do  $\sigma^{(i)} := \sum_{j=0}^{\ell} s^{(j)} i^{j}$ player *i* collects  $\sigma_{1}^{(i)}, \ldots, \sigma_{n}^{(i)}$  from others player *i* finds  $f: \deg(f) \leq d$  with  $|\{k: f(k) = \sigma_{k}^{(i)}\}| > d + t$ if *f* does not exists **then** abort **else** player *i* sends  $\sigma^{(i)} := f(0)$  to all players <u>then, each player locally</u>

find  $g: \deg(g) \leq \ell$  with  $|\{i: g(i) = \sigma^{(i)}\}| > \ell + t$ if g does not exists **then** abort **else** regard the coefficients of g as secrets  $s^{(0)}, \ldots, s^{(\ell)}$ 

Here is what happens behind the scenes. Before protocol ever starts, we *mentally* embed the secrets in the coefficients of a polynomial

$$g(x) := \sum_{j=0}^{\ell} s^{(j)} x^j.$$

We also have in mind evaluations  $\sigma^{(i)} := g(i)$  for all  $i \in [n]$ . Now the protocol starts, which somehow works backwards:

- we first derive the shares  $\sigma^{(i)}$  from shares  $s^{(0)}, \ldots, s^{(\ell)}$  via linear combination;
- then we can recover  $\sigma^{(i)}$  from  $\sigma^{(i)}$ , via the robust Berlekamp-Welch decoder;
- that in turn allows us to recover g from  $\sigma^{(1)}, \ldots, \sigma^{(n)}$ , again via Berlekamp-Welch;
- so finally we can recover the coefficients, i.e. secrets.

The analysis is identical to the first phase of RELIABLE-DISTRIBUTE – just repeat it twice. Provided  $d, \ell < n-2t$ , the protocol always succeeds and, in that case, assembles correctly. The message complexity is  $\Theta(n^2/\ell)$ , and the main saving comes from imposing polynomial structure on the otherwise independent secrets.

**Exercise 4.** Prove the correctness rigorously. Why is it necessary that each  $\sigma^{(i)}$  is assembled towards different players?

**Exercise 5.** If the underlying field is large (in specific, having more than  $n + \ell$  elements), then one can design an alternative RELIABLE-ASSEMBLE. This time, we embed the secrets not as coefficients of g, but the *evaluations* of g. We mentally define  $g := \Lambda_{i \mapsto s^{(i)}}$  and the values  $\sigma_i := g(\ell + i)$  for  $i \in [n]$ . Note that each  $\sigma_i$  is a linear combinations of the secrets. Please complete the description of this protocol and argue about its correctness.

Now we put every pieces together and yield an efficient active MPC protocol:

```
Protocol ACTIVE-MPC
```

```
for i=1\ldots n do
    if randomness depleted then
         RELIABLE-REFILL
    player i RELIABLE-DISTRIBUTE his input
foreach gate \gamma in circuit \varphi
    assume a, b the results from parents
    case \gamma is an addition gate
         take \boldsymbol{a} + \boldsymbol{b} as the result of \gamma
    case \gamma is a multiplication gate
         compute \boldsymbol{a} * \boldsymbol{b} =: \boldsymbol{c} = (c_1, \ldots, c_n)
         if randomness depleted then
             RELIABLE-REFILL
         take the next randomness pair (\rho, \rho^+)
         \delta := c - 
ho^+
         Reliable-Assemble \delta from \delta
         take \boldsymbol{\rho} + (\delta, \dots, \delta) as the result of \gamma
RELIABLE-ASSEMBLE the output
```

There are two worthy comments:

- For simplicity we did not exploit the batch processing ability of RELIABLE-ASSEMBLE what a shame! In real implementation, we should of course parallelize multiplications and do their corresponding  $\delta$ -assembling in one batch.
- The protocol might abort in RELIABLE-REFILL and in RELIABLE-ASSEMBLE. The latter is caused by the possibly high degree (namely 2t) of shares  $\delta$ . Using a trick called *circuit randomization*, it is possible to drop the degree and relocate the abortion issue to RELIABLE-REFILL.

Since RELIABLE-REFILL involves no secret inputs, we can do it before the MPC even starts and prepare sufficient random pairs for future. If it aborts, we ask the problematic player to publish his entire transcript, allowing a judge to pinpoint the cheater. Then we eliminate the cheater and start all over again.

## 6 Asynchronous Broadcast and Consensus

#### 6.1 The asynchronous model

So far we have assumed the idealized synchronous model, a fair approximation to small local networks. But if the network spans across the globe, communications will take longer, which shakes our "instant delivery" assumption.

The asynchronous model takes communication delays into account. Imagine a scheduler in full charge of messages delivery. Any message sent by the players is handed to the scheduler. He can freely decide the arrival time of each message at hand (but of course he cannot deliver to the past or wait till the end of the world...). For the players it means: (i) each message can be delayed for an unbounded finite time; (ii) a message sent early may arrive late.

Let's investigate what happens if we run our protocols in this model. Recall that they have rigid time frames. A player *need to* receive required messages before the next round strikes; otherwise he gets stuck, lags behind, and will be considered malicious by the other players. One might patch the issue by broadcasting "Sorry, I'm stuck now, please wait me for another round." But then a cheater could take advantage of this mechanism and keep everyone waiting forever. It turns out that any easy patch will tear another hole.

Asynchronous protocols come and fix just this. They abandon the concept of rounds but are purely driven by messages. The arrival of a message at a player will activate him to make some progress. Because messages may pop up asynchronously and irregularly, different players may have made different progress so far. Of course, their progress are not independent but instead interconnected (otherwise the protocol can't be correct). The hardest part of asynchronous protocol design is to enforce these interconnections.



#### 6.2 Asynchronous broadcast

As a warm-up, we present an asynchronous broadcast protocol by Bracha.

Protocol Async-Broadcast				
rule	player	on event	do	
(0)	k	started	send $(input, x)$ to all	
(1)	any	got $(input, x)$ from broadcaster k	send $(echo, x)$ to all	
(2)	any	got $(echo, x)$ from $n - t$ players for some $x$	send $(ready, x)$ to all	
(3)	any	got $(ready, x)$ from $t+1$ players for some $x$	send $(ready, x)$ to all	
(4)	any	got $(\texttt{ready}, x)$ from $n - t$ players for some $x$	output $x$ and halt	

**Lemma 22.** Assume  $t := \lfloor (n-1)/3 \rfloor$ . The protocol ASYNC-BROADCAST is

- Consistent: defenders either *all* get stuck, or *all* terminate and output the same value.
- Sound: if  $k \in D$  then all defenders eventually terminate and output k's input.

*Proof.* We argue about soundness first. Assume  $k \in D$  honestly sends (input, x) to all players, which eventually triggers (1) of each defender. On the other hand, the cheaters could by no means trigger (1), so each defender shall echo only the correct x. That creates n-t copies of (echo, x), enough to trigger (2); the cheaters cannot trigger (2) with false values since  $|C| \leq t < n-t$ . This results in n-t copies of (ready, x), enough to trigger rule (4); again the cheaters can't trick defenders into wrong values.

Next we move on to consistency. Suppose  $i \in D$  terminates with value x. We will show that all defenders terminate and output the same x. By (4), defender i has observed n-tcopies of (ready, x), among which at least  $n-2t \ge t+1$  copies came from defenders and will eventually and identically deliver to everyone, triggering (3). That would spawn the number of (ready, x) messages, ensuring that every defender eventually sees n-t copies, enough to trigger (4).

Are we finished? Not quite. We used the cunning word "eventually" to indicate that the asserted behaviour *will occur at some point if the players never terminate*. The worry is, if the "eventuality" arrives too late, a defender might have terminated (due to other causes) and will not execute the rules as usual! Hence we must also show that the conspiring cheaters and scheduler cannot trick the defenders to terminate before our "eventuality" actually happens.

Let's now explore the past so that no subtlety about the future shall tangle with our argument. As we noted, player i saw n-t copies of (ready, x). Well, the message must be *initiated* by someone from the first place. They cannot be all invented out of air by cheaters, otherwise rule (3) shall reject to spawn them. The only possible origin is that some defender  $j \in D$  did invoke rule (2) and disseminated the message. Alright, we travel back and see that j got n-t copies of (echo, x). We collect the senders into a set X.

Now we assume, for the sake of contradiction, that some other  $i' \in D$  outputs an inconsistent value  $x' \neq x$ . Applying the same argument, we conclude a set X' of  $\geq n-t$  players that have sent (echo, x'). Note that  $|X \cap X'| = |X| + |X'| - |X \cup X'| \geq 2(n-t) - n > t$ , so the intersection must contain a defender. But how can he send both (echo, x) and (echo, x') to others? No way if you look at the rules!

The consistency here is weaker than its synchronous counterpart; it could happen that none of the defenders terminate. But the flaw is inherent in asynchronous model. If the broadcaster k – a centralized role – does not send message at all, everyone still have to wait forever because they cannot tell if k is cheating or just slow!

#### 6.3 Asynchronous consensus: first version

In the decentralized setting of consensus, the story becomes different. It turns out that a "king" is not necessary and can be replaced by a communal effort, thus ensuring termination. We will first present a preliminary version that, in practical sense, achieves the desired properties. Later we will study a refined version that satisfies the properties perfectly and terminates with probability 1. Throughout we assume  $t := \lfloor (n-1)/4 \rfloor$ .

Protocol Async-Weak-Consensus				
rule	on event	do		
(0)	started	ASYNC-BROADCAST my value		
(1)	collected $n-t$ values	output $\begin{cases} 0 & \#0 \ge n - 2t \\ 1 & \#1 \ge n - 2t \\ \varnothing & \text{otherwise} \end{cases}$		

Lemma 23. The protocol ASYNC-WEAK-CONSENSUS terminates; moreover, it is

- Consistent: if some  $i \in D$  outputs  $b \in \{0, 1\}$  then no defender outputs b.
- **Persistent:** if all defenders input the same value *b*, then they all output *b*.

*Proof.* Termination follows obviously from soundness in Lemma 22. Now let us inspect persistency, assuming all defenders have input b. Any  $i \in D$  would have gathered n - t inputs when it invokes rule (1). At least (n - t) - t = n - 2t inputs came from defenders and read b; at most t inputs came from cheaters and read  $\overline{b}$ . Hence i shall output b.

We proceed to check consistency. Suppose some  $i \in D$  outputs  $b \in \{0, 1\}$ , then i has received  $\ge n - 2t$  copies of b from broadcast. So by consistency of broadcast (Lemma 22), there can be at most 2t players who had broadcast  $\overline{b}$ . Therefore, every defender  $i' \in D$  shall observe at most 2t < n - 2t copies of  $\overline{b}$ , and thus would not output  $\overline{b}$ .

To boost the result to full consensus, we resort to the power of randomness. The preliminary idea cannot be simpler: Any player who ends up with value  $\emptyset$  will flip a fair coin  $c \in \{0, 1\}$  as his new value. Off you go. With probability  $\ge 2^{-n}$  all defenders happen to agree with each other. Hence, if we repeatedly alternate WEAK-CONSENSUS and the coin flip for  $2^{100n}$  times, defenders arrive at consensus with very good chance!

Needless to say, this is unimaginably slow. The problem is that different players are using *independent* coins. Can we couple their coins in hope of raising the agreement probability? In the synchronous setting there is a trivial solution: We may collect n coins from different players via broadcasts, then add them up (modulo 2) to synthesize a shared random coin. But in the asynchronous setting the solution gets problematic, as some broadcasts might not terminate. If the players only wait for a subset to terminate, then different players might decide on different subsets of coins for summation.

Fortunately, the inconsistency can be controlled stochastically. We illustrate the gist in the protocol ASYNC-COIN-TOSS, assuming a large margin  $t = \sqrt{n}$ . We will show that with constant probability  $\varepsilon > 0$ , every defenders get the same coin value 1; with another chance of  $\varepsilon$  they all get 0; it can be a total mess with the remaining probability. Using more sophisticated constructions and analyses, the corruption tolerance can be lifted to  $t = \lfloor (n-1)/4 \rfloor$  without harming the probability guarantees.

Protocol ASYNC-COIN-TOSS			
rule	on event	do	
(0)	started	broadcast a uniform random $r \in \{-1, 1\}$	
(1)	collected $n-t$ values	let Z be their sum and output $\mathbb{1}\{Z > 0\}$	

Suppose  $i \in D$  has collected values  $r_1, \ldots, r_{n-t}$ . Without loss of generality, assume that  $r_1, \ldots, r_{n-2t}$  came from defenders. By central limit theorem, the partial sum  $Y := \sum_{j=1}^{n-2t} r_j$  roughly follows normal distribution with expectation 0 and variance  $n - 2t = \Theta(n)$ . Hence the event  $\{Y > 3\sqrt{n}\}$  happens with probability  $\varepsilon > 0$  independent of n. This implies

$$\mathbb{P}(E) := \mathbb{P}(Z > 2\sqrt{n}) \ge \varepsilon.$$

Now take any  $i' \in D$ , who might have collected a different set of values and computed sum Z'. But the collections of i and i' share at least n - 2t common values. The remaining

values could bring about at most 2t difference, that is  $|Z' - Z| \leq 2t = 2\sqrt{n}$ . Therefore, conditional on event E, we always have Z' > 0, thus i' outputs 1.

To summarise: with probability at least  $\varepsilon$ , all defenders output 1. By a symmetric argument, with probability at least  $\varepsilon$ , all defenders output 0.

Protocol Async-Consensus			
rule	on event	do	
$(\top)$	started	enter iteration $h := 1$	
(h0)	entered iteration $h$	Async-Weak-Consensus <sub><math>h</math></sub>	
		Async-Coin- $Toss_h$	
(h1)	ASYNC-WEAK-CONSENSUS <sub><math>h</math></sub> $\rightarrow b$	update my value $x := \begin{cases} b & b \neq \emptyset \\ c & b = \emptyset \end{cases}$	
	and ASYNC-COIN-TOSS $_h \rightarrow c$	enter iteration $h+1$	
$(\perp)$	entered iteration 100	output my value and terminate	

Now we can present our asynchronous consensus protocol.

Theorem 24. The protocol ASYNC-CONSENSUS terminates and is

- Consistent: all defenders output the same value with probability at least  $1 (1 \varepsilon)^{100}$ .
- **Persistent:** if all defenders input the same value *x*, then they all output *x*.

Exercise 6. Prove the theorem.

#### 6.4 Asynchronous consensus: second version

In algorithmic terms, our first version of consensus protocol is a Monte Carlo procedure that always terminates but allows some margin of error. We can turn it into a Las Vegas procedure by "repeating until success". The main technical difficulty is the *detection of success*. With cheaters playing all around, how do we tell when consensus is attained? It comes to mind that the "grade" in GRADED-CONSENSUS can help us decide. Below is just a port of that protocol to the asynchronous setting.

Protocol Async-Graded-Consensus			
rule	on event	do	
(0)	started	ASYNC-BROADCAST my value	
(1)	collected $n-t$ values	let $d_0$ count the 0's	
		let $d_1$ count the 1's	
		$b := \mathbb{1}\{d_1 \ge d_0\}$	
		$\sigma := \mathbb{1}\{d_b \ge n - 2t\}$	
		output $(b, \sigma)$ and halt	

Given this, each iteration of ASYNC-CONSENSUS is fairly straightforward, as shown by the diagram below. The same workflow is repeated over and over, with the new x in the end replacing that in the beginning. Whenever player i have collected t+1 copies of (done, a) for some a, it outputs a and terminates.

$$x \in \{0, 1\}$$
Async-Coin-Toss
$$x \in \{0, 1\}$$
Async-Weak-Consensus
$$c \in \{0, 1\}$$

$$x \in \{0, 1, \emptyset\}$$
Async-Weak-Consensus
$$x \in \{0, 1, \emptyset\}$$
Async-Graded-Consensus
$$\sigma \in \{0, 1\}$$

$$b \in \{0, 1\}$$
Async-Broadcast(done, b) if  $\sigma = 1$ 

Lemma 25. For ASYNC-GRADED-CONSENSUS embedded in the protocol, we have:

- If some defender outputs (b, 1) then all defenders output either (b, 0) or (b, 1).
- If all defenders input the same value b then all defenders output (b, 1).

#### Proof.

- If some defender outputs (b, 1), then from his perspective  $d_b \ge n 2t$ . We make two parallel observations:
  - Due to consistency of ASYNC-BROADCAST, all defenders shall eventually observe n-2t copies of b as well. Of course, they might have terminated earlier. But it's safe to say that they do count  $\ge n-3t$  copies of b before termination.
  - Note that  $d_b > |C|$ , so some copy of b did come from a defender, say  $i \in D$ . By consistency of the previous ASYNC-WEAK-CONSENSUS, we know that *no* defender had input  $\bar{b}$  to ASYNC-GRADED-CONSENSUS. Hence any defender can count at most  $|C| \leq t$  copies of  $\bar{b}$ .

Since n - 3t > t by our choice of t, all defenders will output  $(b, \cdot)$  as well.

• If all defenders input b, then any defender shall count  $\ge n - 2t$  copies of b and  $\le t$  copies of  $\overline{b}$ . So he will output (b, 1).

Now the main theorem easily follows.

**Theorem 26.** Our new version of ASYNC-CONSENSUS terminates with probability 1 (actually within constant phases in expectation). Upon termination, it is

- **Consistent:** all defenders output the same value.
- **Persistent:** if all defenders input the same value *x*, then they all output *x*.

Exercise 7. Prove the theorem.

## 7 Asynchronous MPC

Assume  $t := \lfloor (n-1)/4 \rfloor$ . With the help of asynchronous broadcast and consensus, we can design asynchronous MPC protocol. It roughly follows the framework in Section 5, which we now review.

- Reliable-Refill
  - each player generates a random value and shares it with degrees  $\leq t$  and  $\leq 2t$ .
  - expand these randomness via hyperinvertible map;
  - assemble some of the expanded randomness, abort if any inconsistency is observed;
  - keep the remaining expanded randomness.
- Reliable-Distribute
  - the distributer assembles a fresh randomness via Berlekamp-Welch, masks his secret, and broadcasts the result;
  - each player unmasks it locally.
- RELIABLE-ASSEMBLE reconstructs a secret towards every player, using Berlekamp-Welch decoder.
- Multiply
  - players locally perform multiplication c := a \* b and mask  $\delta := c \rho^+$ ;
  - players reliably assemble  $\delta$ ;
  - players locally unmask  $\boldsymbol{\rho} + (\delta, \dots, \delta)$ .

Let's address the tricky points that we have highlighted. (i) Berlekamp-Welch decoder has the potential of abortion, but luckily  $|D| \ge n - t > 3t \ge d + t$  for  $d \in \{t, 2t\}$  under our assumption, so we are safe. (ii) RELIABLE-REFILL is susceptible to abortion too, and this time there's no lucky fix. (iii) RELIABLE-DISTRIBUTE calls for broadcast which might not terminate; but the problem is unsolvable since the distributer is a centralized role.

In the following we suppress problem (ii) by redesigning both RELIABLE-REFILL and RELIABLE-DISTRIBUTE. Originally, the latter relies on the former, but now we will turn the dependency around.

#### 7.1 A new distribution protocol

Our new distribution protocol makes use of 2D polynomials; the added dimension allows other players to verify the polynomial degree without compromising privacy. After the check completes, the 2D polynomial is projected back to the familiar 1D case.

Let us introduce some terminology. A 2D polynomial f(x, y) of degree at most d is a function that, for all fixed  $x, y \in \mathbb{F}$ , both  $f(\cdot, y)$  and  $f(x, \cdot)$  are polynomials of degree at most d. Define  $F_d^2(s) := \{f : \deg(f) \leq d \land f(0, 0) = s\}$ .

Protocol ASYNC-DISTRIBUTE			
#	player	on event	do
(0)	k	started	sample $f \in F_t^2(s)$ uniformly
			send $f(i, \cdot), f(\cdot, i)$ to each $i$
(1)	any $i$	got $f(i, \cdot), f(\cdot, i)$ of degree $\leq t$	send $v_{ij} := f(i, j)$ to each j
(2)	any $j$	got $v_{ij}$ from $i$	if $v_{ij} = f(i, j)$ then
			Async-Broadcast " $j$ approves $i$ "
(3)	any $j$	observed $n-t$ players who	record these players in my set $K$
		approve each other	
(4)	any $j$	got $2t+1$ many $v_{ij}$ $(i \in K)$ s.t.	take my share as $s_j := g(0)$
		$\exists g : \deg(g) \leq t \text{ with } g(i) = v_{ij}$	

Remark 27. A defender j might not be able to make himself into K.

Lemma 28. ASYNC-DISTRIBUTE has similar guarantees to that of ASYNC-BROADCAST:

- Defenders either *all* get stuck, or *all* terminate and their shares lie on a polynomial of degree at most *t*.
- If  $k \in D$  then all defenders eventually terminate and their shares lie on the polynomial  $f(\cdot, 0) \in F_t(s)$ .

*Proof.* If  $k \in D$  then obviously all defenders terminate. Next we consider the general case. Assume defender  $j \in D$  terminates, so that he saw a set K of n - t mutually approving players. All defenders will eventually receive these (broadcast) approvals by Lemma 22 and activate (3). Since  $|D \cap K| \ge n - 2t > 2t$ , there are always enough values to trigger (4), the termination condition.

We move on to show the semantic claims. Suppose that a defender  $j \in D$  observed the mutual-approval set K, and gathered  $\{v_{ij}\}_{i \in I}$  for some  $I \subseteq K$ : |I| = 2t + 1 with  $g(i) = v_{ij}$  for polynomial g of degree  $\leq t$ . We make several observations:

- a) Note that  $D \cap K$  contains mutually approving defenders. So for  $a, b \in D \cap K$ , there is no ambiguity to write  $v_{ab}$ . Moreover, due to condition in rule (1), the polynomials  $f(a, \cdot)$  and  $f(\cdot, b)$  have degree  $\leq t$ , thus the map  $(D \cap K)^2 \ni (a, b) \mapsto v_{ab}$  determines a 2D polynomial  $\Lambda_{(D \cap K)^2}$  of degree  $\leq t$  via Lagrange interpolation.
- b) Similarly, the subset  $D \cap I$  determines a 2D polynomial  $\Lambda_{(D \cap I)^2}$  of degree  $\leq t$  via Lagrange interpolation.
- c) Then observe that  $|D \cap I| \ge t + 1$ . But  $\Lambda_{(D \cap I)^2}$  and  $\Lambda_{(D \cap K)^2}$  agree on  $(D \cap I)^2$ , which is enough to ensure  $\Lambda_{(D \cap I)^2} = \Lambda_{(D \cap K)^2}$ .
- d) Finally and apparently,  $g(\cdot) = \Lambda_{(D \cap I)^2}(\cdot, j)$ . Therefore  $s_j := g(0) = \Lambda_{(D \cap I)^2}(0, j)$ .

Now we put things together. For all defenders  $j, j' \in D$ , we have  $|D \cap K \cap K'| \ge n - 3t \ge t + 1$ , thus  $\Lambda_{(D \cap K)^2} = \Lambda_{(D \cap K \cap K')^2} = \Lambda_{(D \cap K')^2}$ . We denote this unique 2D polynomial as  $\Lambda$ . By observations (c) and (d) we have

$$s_j = \Lambda(0, j).$$

Hence the shares for all  $j \in D$  do lie on a 1D polynomial of degree  $\leq t$ . Moreover, it passes through  $\Lambda(0,0)$ , which equals s if the distributer  $k \in D$ .

Remark 29. Diagrammatically, the proof couples two defenders by the chain  $I \leftrightarrow K \leftrightarrow K' \leftrightarrow I'$ . The detour to K and K' is crucial: It is not possible to couple I and I' by a direct counting argument.

#### 7.2 Finding core set

Suppose every player is taking part in n parallel protocols  $P_1, \ldots, P_n$ . The protocol  $P_k$  was initiated by player k and satisfies the following termination conditions:

- If  $k \in D$  then every defender terminate in  $P_k$ ;
- If  $k \in C$  then the defenders either all get stuck in  $P_k$ , or all terminate in  $P_k$ .

Clearly ASYNC-BROADCAST is an example.

The following protocol makes sure that the defenders agree on a set  $S \subseteq \{1, \ldots, n\}$  of size  $\geq n-t$  such that all  $\{P_k\}_{k \in S}$  terminate.

Protocol ASYNC-CORE				
#	player	on event	do	
(0)	any $i$	terminated in protocol $P_k$	input $0 \rightarrow \text{Async-Consensus}_k$	
			if $i$ hasn't input to it yet	
(1)	any $i$	$\{k: Async-Consensus_k \rightarrow 0\}$	$\forall k, \text{ input } 1 \rightarrow \text{Async-Consensus}_k$	
		reaches size $n-t$	if $i$ hasn't input to it yet	
(2)	any $i$	finished in all	output	
		Async-Consensus <sub><math>k</math></sub>	$\{k: Async-Consensus_k \rightarrow 0\}$	

**Lemma 30.** Every defender  $i \in D$  terminates in ASYNC-CORE (almost surely) and outputs the same set  $S \subseteq \{1, ..., n\}$ . Moreover  $|S| \ge n - t$  and every defender eventually terminates in protocols  $\{P_k\}_{k \in S}$ .

*Proof.* First we show that every defender shall terminate in ASYNC-CORE. The argument is arranged in steps:

- We claim that there exists a defender that invokes (1). Suppose to the contrary that no defender ever invokes it. Let's take  $k \in D$ . By assumption, all defenders terminate in  $P_k$ , so they will input 0 to ASYNC-CONSENSUS<sub>k</sub> via rule (0). (They cannot have input 1 already since (1) is never invoked by assumption!) Now by Theorem 26, ASYNC-CONSENSUS<sub>k</sub> almost surely outputs 0. This works for all  $k \in D$ , and  $|D| \ge n - t$  is enough to trigger (1), a contradiction.
- Once the very first defender invokes (1), we know  $\{k: ASYNC-CONSENSUS_k \rightarrow 0\}$  has size n-t. Due to consistency of ASYNC-CONSENSUS, all defenders can spot at least n-t ASYNC-CONSENSUS's that output 0, eventually. So in fact all defenders will invoke (1).
- Rule (1) instructs the defenders to fill in all missing inputs. Again by Theorem 26, all ASYNC-CONSENSUS<sub>k</sub> (k = 1, ..., n) shall terminate almost surely and kick off rule (2).

Now that they terminate, clearly they output the same set S by consistency. As we have pointed out, one (and thus every) defender fires rule (1), implying  $|S| \ge n - t$ .

It remains to argue that every defender shall terminate in  $\{P_k\}_{k\in S}$ . Let's consider any  $k \in S$ , so that  $Async-Consensus_k \rightarrow 0$ . Observe there is at least one defender, say  $i \in D$ , who had input  $0 \rightarrow Async-Consensus_k$ ; otherwise by persistency the output would be 1. Why did *i* input 0? Because *i* terminated in protocol  $P_k$ . But then all defenders eventually terminate in  $P_k$  by the guarantee of protocol  $P_k$ .

## 7.3 A new refill protocol

Hopefully, the refill protocol manifests itself at this point.

Protocol Async-Refill				
¥	¥	player	on event	do
((	D)	any $i$	started	ASYNC-DISTRIBUTE (denoted $P_i$ ) a random $r_i$ and ASYNC-CORE on $P_1, \ldots, P_n$
(	1)	any $i$	Async-Core $\rightarrow S$ and $P_j \rightarrow r_j$ for all $j \in S$	compute (component <i>i</i> of) $\boldsymbol{r} := \sum_{j \in S} \boldsymbol{r}_j$

## 7.4 Debate of the model

Surely you can debate that the scheduler in the asynchronous model is too strong. Maybe in reality, the scheduler (aka nature) can only delay a message up to 10 seconds. If that is true, then we can use synchronous protocols with 10 seconds per round. Everything should go perfectly. Why bother using asynchronous protocols?

Well, from a pragmatic view, a delay of 10 seconds is rare. Say 95% messages can arrive within a second and only 1% messages need 10 seconds. But the synchronous model must prepare for the worst case and spend 10 seconds per round! In contrast, an asynchronous model is more flexible and adapts automatically to the delivery pace of messages, thus statistically saving plenty of waiting time.