## **Interactive Coding - Lecture 1**

Challenge: Can you preserve an interaction when channel is (adversarially/randomly) noisy?

**Example:** Two players playing online chess over noisy channel.

Interaction:

- Two players A and B.
- Alice has a collection of functions  $\Pi_A = \left\{ \Pi_A^{(i)} \right\}$ . Similarly, Bob has  $\Pi_B$ .
- $\Pi_A^{(i)} : (\{0,1\}^*)^{i-1} \to \{0,1\}^* \cup \{\bot\} \text{ for odd } i.$
- $\Pi_B^{(i)} : (\{0,1\}^*)^{i-1} \to \{0,1\}^* \cup \{\bot\}$  for even *i*.
- $\Pi_A^{(i)}(w_1, \ldots, w_{i-1})$  specifies what Alice would say in round *i* after history of transcript  $w_1, \ldots, w_{i-1}$ .
- $\Pi_A^{(k)}(w_1, \ldots, w_{i-1}) = \bot$  means end of interaction. Output of the interaction is the entire transcript  $w_1, \ldots, w_k$ .
- We'll consider deterministic protocols, so  $w_i$  are deterministic functions of  $w_1, \ldots, w_{i-1}$ .
- In general w<sub>i</sub> ∈ {0,1}\*, but we will consider w<sub>i</sub> ∈ {0,1}, by stretching interaction by a factor of 2.
- In general, length could be variable. But we will consider fixed length *k*.

Noisy interactive coding:

- $w_i$  is received as  $w'_i$ . For  $\alpha$  fraction of the communication, i.e.  $\alpha n$  total errors (can consider adversarial or random errors).
- Without correction: Immediately changes all future messages & so entire interaction can change (recall: chess example).
- Attempt 1: Standard Error correction in every round. Adversary can change  $E(w_i)$  to  $E(w'_i)$  and get same effect. Can work in random error model with  $O(\log n)$  blow up in communication.
- Need better solution!

Solution Concept: Interactive Coding with  $\alpha$ -fraction errors.

- $(\Pi_A, \Pi_B) \mapsto ((\sigma_A, f_A), (\sigma_B, f_B))$
- For every sequence of  $a_1, a_2, \ldots, a_n$  and  $b_1, \ldots, b_n$  s.t.
  - $a_i = \sigma_A^{(i)}(a_1, ..., a_{i-1})$  for odd *i*. -  $b_i = \sigma_B^{(i)}(b_1, ..., b_{i-1})$  for even *i*. - # { $i : a_i \neq b_i$ }  $\leq \alpha n$ .

it holds that  $f_A(a_1, ..., a_n) = f_B(b_1, ..., b_n) = w_1, ..., w_k = \text{Output}(\Pi_A, \Pi_B)$ . Here  $(a_1, ..., a_n)$  is Alice's version of the transcript;  $(b_1, ..., b_n)$  is Bob's version.

• Note that  $\sigma_A$  and  $\sigma_B$  are possibly acting on different strings!

## **Tree Codes**

**Defn:**  $T : [d]^n \to [q]^n$  is a  $(d, q, \delta)$ -tree code if

- $T(m_1, \ldots, m_n)_i$  depends only on  $m_1, \ldots, m_i$ . Thus, another way to interpret *T* is using label  $L : [d]^{\leq n} \rightarrow [q]$ , and  $T(m_1, \ldots, m_n) = L(m_1) \circ L(m_1, m_2) \circ \cdots \circ L(m_1, \ldots, m_{n-1})$ . (Figure: Labelling arcs of a *d*-ary tree.)
- For any  $m_1, \ldots, m_n$  and  $m'_1, \ldots, m'_n$  such that  $m_1 = m'_1, \ldots, m_i = m'_i$  and  $m_{i+1} \neq m'_{i+1}$ , it holds,

 $\Delta(T(m_1,\ldots,m_n),T(m'_1,\ldots,m'_n)) \geq \delta(n-i)$ 

Note that prefix necessarily agrees.

- *Remark:* This is unlike regular coding theory where  $[q]^k \rightarrow [q]^n$ . We want *n* coordinates of input as well. We compensate by making output alphabet larger.
- Allows, decoding as long all suffixes have small fraction of errors. If  $(s_1, \ldots, s_i) = T(m_1, \ldots, m_i)$ , suppose  $r_1, \ldots, r_i$  is such that  $\Delta((s_{j+1}, \ldots, s_i), (r_{j+1}, \ldots, r_i)) \ge \delta(i-j)/2$  for all j, then  $D(r_1, \ldots, r_i) = (m_1, \ldots, m_i)$ .

Alternately, suppose  $(s_1, \ldots, s_i) = T(m_1, \ldots, m_i)$ , suppose  $r_1, \ldots, r_i$  decodes to  $m'_1, \ldots, m'_i$ where  $m_1 = m'_1, \ldots, m_j = m'_j$ , but  $m_{j+1} \neq m'_{j+1}$ . Then,  $\Delta((s_{j+1}, \ldots, s_i), (r_{j+1}, \ldots, r_i)) \geq \delta(i-j)/2$ .

Tree codes exist!

- Random "tree" functions fail with high probability (close to 1, in fact).
- Random linear code works!

$$T(m) = \begin{bmatrix} m_1 & \cdots & m_n \end{bmatrix} \begin{bmatrix} a_1 & a_2 & \cdots & a_n \\ & a_1 & \cdots & a_{n-1} \\ & & \ddots & \vdots \\ & & & & a_1 \end{bmatrix}$$

we interpret  $a_i \in \mathbb{F}_q$  and  $m_i \in [d] \subseteq \mathbb{F}_q$ . That is,  $T(m)_1 = a_1 m_1$   $T(m)_2 = a_2 m_1 + a_1 m_2$   $\cdots$  $T(m)_i = a_i m_1 + a_{i-1} m_2 + \cdots + a_1 m_i$ .

• Proof sketch: For any  $m_1, \ldots, m_j$  and  $m'_1, \ldots, m'_j$ , such that  $m_1 \neq m'_1$ , the event of  $T(\mathbf{m})_i \neq T(\mathbf{m}')_i$  happens with probability 1 - 1/q and is independent for different *i*.

Only depends on  $(m_1 - m'_1), \ldots, (m_j - m'_j)$ . Union bound over different  $d^j$  different path differences of length *j*. Automatically handles all pairs of paths, which diverge in the last *j* positions.

## **Using Tree Codes**

Two approaches:

- Schulman : "Local" approach. More natural, but weaker analysis.
- Braverman-Rao : "Holistic" approach. Less natural, but less wasteful (provably).

Common features:

- Alice and Bob maintain states  $S_A^{(i)}$  and  $S_B^{(i)}$  for  $i = 1, \dots, N$  for some N = O(n).
- Sequence of states  $S_A^{(1)}, \ldots, S_A^{(t)}$  compressed into  $x^{(1)}, \ldots, x^{(t)}$  in a prefix respecting way.
- On moving to state  $S_A^{(t+1)}$ , communicate  $L(x^{(1)}, \ldots, x^{(t+1)})$  to Bob.

Differences:

- Description of state?
- What kinds of transitions are possible?
- Rules for the transitions?
- Analysis? How many fraction of errors tolerated?

Pre-processing for Schulman's protocol:

- Alice and Bob exchange only 1 bit in each round simultaneously. (can be done with another factor 2 blow up). This makes the situation symmetric w.r.t. Alice and Bob.
- Protocol communicates fixed *n* bits in total (where *n* is known to Alice and Bob). They extend the protocol up to O(n) rounds by transmitting 0's after the end.

Schulman's protocol preliminaries:

- Original protocol is a 4-ary tree, where in each round Alice and Bob exchange 1 bit each.
- $S_A^{(i)}$  is the node reached in  $\Pi$ , after *i* rounds.
- Evolution will be such that  $S_A^{(i)} \in S_A^{(i-1)} + \{00, 01, 10, 11, H, B\}.$
- $x_A^{(i)}$  is the transition made in going from  $S_A^{(i-1)}$  to  $S_A^{(i)}$ , in addition to the next bit to be sent by Alice.
- Communicate  $L(x_A^{(1)}, ..., x_A^{(i)})$  to Bob. Note that d = 12, since  $x_A^{(i)} \in \{00, 01, 10, 11, H, B\} \times \{0, 1\}$ .

Actual protocol:

- Initial state  $S_A^{(1)}$  is at root.  $x_A^{(1)} = (H, a_1)$ .
- Repeat N = O(n) times. In iteration *i*:
  - Transmit  $L(x_A^{(1)}, \ldots, x_A^{(i)})$  to Bob.

- Given received sequence from Bob, obtain  $\overline{y}_B^{(1)}, \ldots, \overline{y}_B^{(i)}$  (this is Alice's guess for  $y_B^{(1)}, \ldots, y_B^{(i)}$ ).
- Compute  $\overline{S}_{B}^{(i)}$  and the next bit  $b_i$  that Bob sent.
- Depending on relation between  $S_A^{(i)}$  and  $S_B^{(i)}$ , do
  - \* If  $S_A^{(i)} = \overline{S}_B^{(i)}$ , then move  $S_A^{(i)}$  to child given by  $(a_i, b_i)$ . In this case  $x_A^{(i+1)} = ((a_i, b_i), a_{i+1})$ . \* If  $S_A^{(i)}$  is ancestor of  $\overline{S}_B^{(i)}$ , then hold. In this case,  $x_A^{(i+1)} = (H, a_i)$ .
  - \* If  $\overline{S}_B^{(i)}$  is ancestor of  $S_A^{(i)}$ , then back up one step. In this case  $x_A^{(i+1)} = (B, a')$ , where a' is the bit sent by Alice at the parent of  $S_A^{(i)}$ .

Analysis:

- Let the true states of Alice and Bob be  $S_A$  and  $S_B$  at time *i*. Let *S* be the least common ancestor of  $S_A$  or  $S_B$ .
- Define potential  $\Phi(i) = \operatorname{depth}(S) \max \{\operatorname{depth}(S_A) \operatorname{depth}(S), \operatorname{depth}(S_B) \operatorname{depth}(S)\}$ . This is depth of *S* minus the distance from *S* to the further of  $S_A$  and  $S_B$ .
- Define good round as one where both Alice and Bob decode the entire history of  $x_A$  and  $y_B$  correctly.
- In good round, potential increases by 1. In bad round, potential decreases by at most 3.
- If  $N_g$  (resp.  $N_b$ ) is number of good rounds (resp. bad rounds).
- Then  $\Phi(N) \ge N_g 3N_b = N 4N_b$ .
- Key Lemma (about tree codes): Let *T* be a tree code of distance 0.7 (i.e.  $\geq 2/3$ ). Suppose  $(s_1, \ldots, s_n) = T(m_1, \ldots, m_n)$ . Let  $(r_1, \ldots, r_n)$  be such that  $\Delta(\mathbf{s}, \mathbf{r}) = \beta n$ . Let *I* be the set of coordinates such that  $D(r_1, \ldots, r_i) \neq (m_1, \ldots, m_i)$ . Then,  $|I| \leq 3\beta n$ .

*Proof.* If an error happens on coordinate *i*, include *i* in *I*. Additionally, include 2 more coordinates after that in *I* as *potentially bad*. If there are errors on the coordinates that were intended to be included in *I*, then include coordinates after that. Every coordinate not in *I* has the property that every suffix has at most 1/3 fraction of errors. Hence, every unmarked node is decoded correctly. Hence  $|I| \leq 3\beta n$ .

*Remark:* If we choose a tree code of distance  $1 - \varepsilon$ , then we can generalize to saying that  $|I| \le (2\beta/(1-\varepsilon)) \cdot n$ .

- Finally, finishing the proof. Say  $\beta_A N$  of Alice's messages are corrupted, and  $\beta_B N$  of Bob's messages are corrupted. Note, that overall error fraction is  $\beta = (\beta_A + \beta_B)/2$ . From lemma, there are at most  $(3\beta_A)N$  rounds where Bob decodes incorrectly;  $(3\beta_B)N$  rounds where Alice decodes incorrectly. So, at most  $(3(\beta_A + \beta_B))N = (6\beta)N$  rounds in which at least one party decodes incorrectly.
- Thus,  $N_b \leq 6\beta N$ . Thus, potential  $\Phi$  at the end is at least  $N(1 24\beta)$ .
- Suppose  $\beta = 1/48$ . Then, potential  $\Phi$  at the end is at least N/2. That is, choose N > 2n.

- Suppose  $\beta = 1/24 \varepsilon$ , then potential is at least  $24\varepsilon N$ . That is, choose  $N > n/24\varepsilon$ .
- Can be further improved to  $1/16 \varepsilon'$  by using tree codes with distance  $1 \varepsilon$ . (Needs to be checked: Schulman showed an error correction of 1/240.)

Summary of Schulman's solution:

- Corrects  $\Omega(1)$  fraction errors.
- Not maximal fraction?
- Tree codes exist. But constructive? Decoding is brute force.
- Weakness: Progress is made only when entire transcript is decoded correctly. Moreover, 3x negative progress is made otherwise. Can we avoid the negative progress?

Current state of the art:

- Exact capacity (even with random errors) unknown.
- Maximal fraction of errors? Essentially known [Braverman-Rao].
- Maximal error fraction over binary alphabet?
- Known if adversary has separate budget for Alice and Bob corruptions.
- Rate as error goes to 0. Essentially known. Rate  $\approx 1 \widetilde{O}(\sqrt{\epsilon})$ . [Kol-Raz], [Haeupler]. In contrast to one-way communication where rate is  $1 \widetilde{O}(\epsilon)$ .
- Polynomial time encoding + decoding: essentially known [Brakerski-Kalai], while losing out on errors tolerated.

## **Interactive Coding - Lecture 2**