

# CS229r. Interactive Coding - 1

①  
[4/18/17 &  
4/20/17]

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

Example: Two players playing online chess over noisy channel. (ignoring strategic/computational issues).

Interaction:  $A \rightleftarrows B$ :

given by two functions:  $\Pi_A = \{\Pi_A^{(i)}\}_{i \text{ odd}}$ ,  $\Pi_B = \{\Pi_B^{(i)}\}_{i \text{ even}}$

$$\Pi_A^{(i)}: (\{0,1\}^*)^{i-1} \rightarrow \{0,1\}^* \cup \{\perp\} \quad i \text{ odd}$$

$$\Pi_B^{(i)}: (\{0,1\}^*)^{i-1} \rightarrow \{0,1\}^* \cup \{\perp\} \quad i \text{ even}$$

$\Pi_A^{(i)}(w_1 \dots w_{i-1})$  specifies ~~what~~ what Alice would say in round

$i$  after history of transcript  $w_1 \dots w_{i-1}$ .

$\Pi_A^{(i)}(\dots) = \perp \Rightarrow$  end of interaction. Output =  $(w_1 \dots w_R)$ .

In general:  $w_i$  may be random variables, but for us  $w_i = \text{det. function of } w_1 \dots w_{i-1}$ .

In general:  $w_i \in \{0,1\}^R$ , but for us suffices

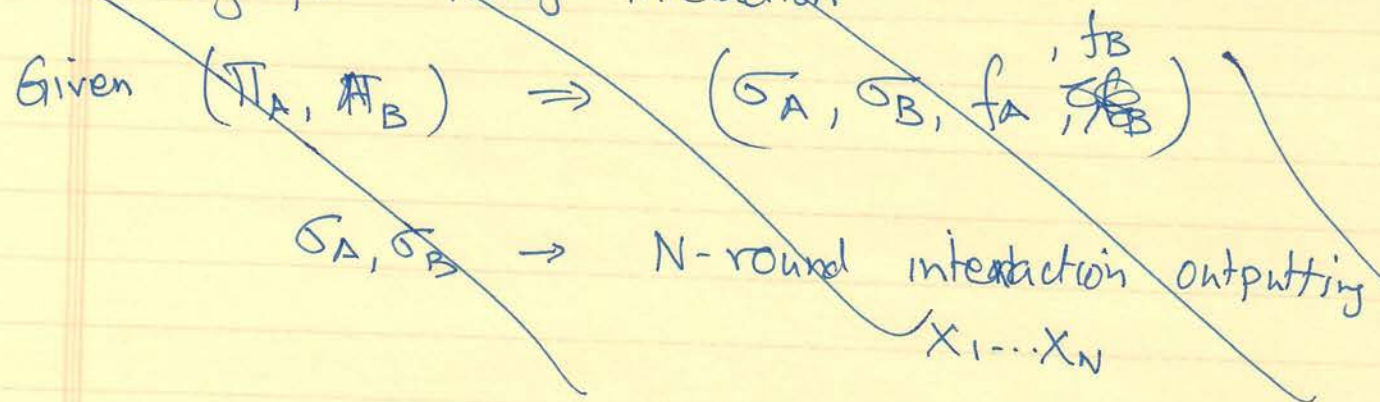
to consider  $w_i \in \{0,1\}$ . [stretches interaction by at most factor of 2].

In general: variable length interaction, but for us length =  $R$ .

# Noisy Interactive Coding [Schulman '92]

- What happens to interaction if channel is noisy.
- Send  $w_i$  receive  $w_i'$  ]  $\frac{1}{R}$  fraction of interaction
- Without correction  $\Rightarrow$  immediately changes all future messages & ~~the~~ so entire interaction changes.
- With (standard) Error Correction: Adversary can still change  $E(w_i)$  to  $E(w_i')$  & get same effect.
- Need New Solution!

Simulating from Noisy interaction



Solution Concept: Interactive coding with  $\epsilon$ -fraction error

$$\Pi_A, \Pi_B \rightarrow (\sigma_A, \sigma_B, f_A, f_B)$$

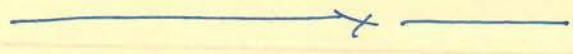
s.t. for every sequence  $a_1 \dots a_n, b_1 \dots b_n$  s.t.

- $a_i = \sigma_A^{(i)}(a_1 \dots a_{i-1})$  odd  $i$
- $b_i = \sigma_B^{(i)}(b_1 \dots b_{i-1})$  even  $i$

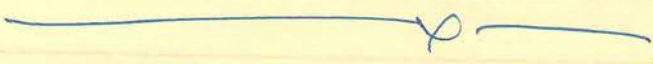
$$\# \{i \mid a_i \neq b_i\} \leq \epsilon n$$

it is the case that

$$f_A(a_1 \dots a_n) = f_B(b_1 \dots b_n) = w_1 \dots w_k = \text{output}(\Pi_A, \Pi_B)$$



( $\sigma_A$  &  $\sigma_B$  possibly operating on different strings!)



Solution Ingredient: Tree code  $(c, d, \delta)$ -tree code  $T$ .

$$T \subseteq \{0,1\}^{c \cdot n} \rightarrow \{0,1\}^{d \cdot n}$$

s.t. ①  $T(m_1 \dots m_n)$  depends only on  $T(m_1 \dots m_i)$   
 $\uparrow$   
 $\{0,1\}^d$   $m_j \in \{0,1\}^c$

②  $\forall m_1 \dots m_n, m'_1 \dots m'_n$  s.t.  $m_i = m'_i \dots m_i = m'_i$   
&  $m_{i+1} \neq m'_{i+1}$

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

[Prefix necessarily agrees; but suffix may not.]

Rate  
=  $\frac{c}{d}$

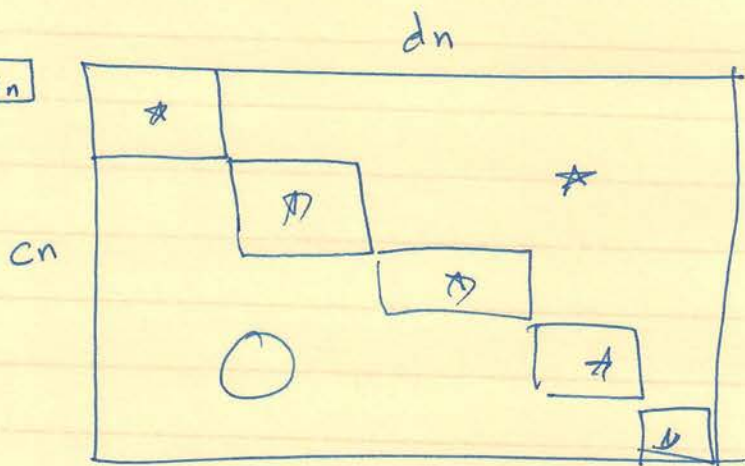
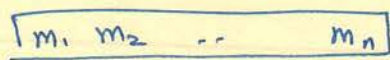
# Rest of Lecture

- ① Proving Tree codes exist
- ② Using Tree Codes.

————— x —————

- ① • Random "Tree" functions fail w.p.  $\rightarrow 1$ ; (so need care)
- Random linear code works!

$T(m)$ :

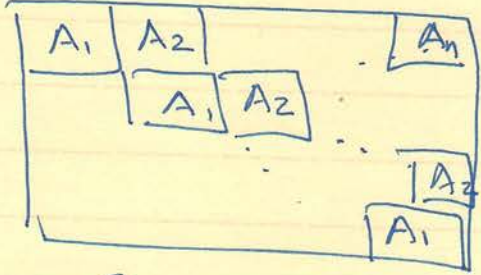


Encoding matrix is "upper triangular".

Claim:  $\Pr_T [i^{th} \text{ prefix of } T \text{ works}] \geq C - \exp(-i)$ .

" $i^{th}$  prefix works" if  $\forall m_1 \dots m_i$

$T = \text{Toeplitz} =$



$i^{th}$  prefix works if  $\forall j \leq i$

$\forall m_1 \dots m_j$  with  $m_i \neq 0 \quad \delta(T_j(m_1 \dots m_j), 0) \geq \delta \cdot j \cdot d$

Proof Omitted

## Using Tree Codes: (Non-Trivial)

Two approaches: (1) Schulman: "Local" approach  
(2) Braverman-Rao: "Holistic" approach.

Schulman: More Natural; Analysis weaker  
B-R: Less Natural; less wasteful (provably).

### Common features

- 1) A + B maintain states:  $S_A^{(i)}, S_B^{(i)}$   $i=1 \dots \ln$ .
- 2) Compress:  $S_A^{(1)} \dots S_A^{(t)} \Rightarrow X^{(1)} \dots X^{(t)}$   
(prefix-respecting)
- 3) Tree code  $(X_A^{(1)} \dots X_A^{(t)})$  & communicate to B  
(similarly for Bob).

### Differences

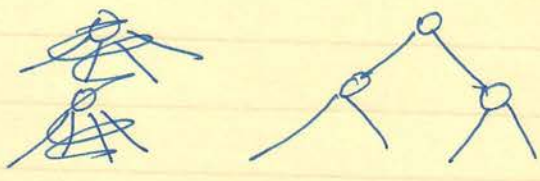
- 1) State = ?
- 2) Evolves = How?
- 3) Analysis ?

Common Preprocessing: 1) Alice + Bob exchange 1 bit simult.  
at each stage (in original protocol)

2) original protocol extended to  $\ln$  rounds with  
 $4n$  rounds computing - nothing.

→ At end of simulation Players agree  
on ~~at~~ node at  $n^{\text{th}}$  level.  
( $w_1 \dots w_n$ ).

Schulman Protocol



• Protocol tree:  $\Pi$   
 [ ~~Binary~~ <sup>Binary</sup> rooted tree  
 of depth  $n$  ]

∴ Nodes at depth  $i$  report bits ~~exchanged~~ <sup>sent</sup> in first  $i$  rounds.

$\in \{0,1\}^i$

•  $S_A^{(i)}$  = ~~that~~ node labelled node reached in  $\Pi$  after  $i$  rounds (according to  $A$ ).

• Evolution Property (to be delivered later)

(a)  $|S_A^{(i)}| = |S_A^{(i-1)}| \pm 1$  [ move locally ]

↑  
length = perceived

↑  
can go down.

(b)  $S_A^{(i)}$  = <sup>Progress</sup> Bob comm. node.

must go down due to errors!

• Compression  $(S_A^{(1)} \dots S_A^{(l)})$

$= X_1^F \dots X_i^B$

s.t.  $(S_A^{(i-1)}, X_i) \Rightarrow S_A^{(i)}$  <sup>determine</sup>

Note  $X_i \in \{0,1\}^c$

• Communication:  $T(X_1 \dots X_i)_i$  ( $A \rightarrow B$  in round  $i$ )

State Evolution:

only even # indices

Given communication:  $a_1 \dots a_{i-1}$   ~~$\sum_{1 \dots i-1}$~~   $\in \{0,1\}^{\frac{d(i-1)}{2}}$  ~~from B to A~~ ~~no for~~ ~~from B to A~~

(i) Decode  ~~$(\sum_{1 \dots i-1})$~~   $= \hat{y}_1 \dots \hat{y}_{i-1} \in \{0,1\}^{c(i-1)}$

(ii) Compute  $G_B^{(1)} \dots G_B^{(i-1)}$  from  $(\hat{y}_1 \dots \hat{y}_{i-1})$

(iii) if  $S_A^{(i-2)} = \text{parent}(G_B^{(i-1)})$

then  $S_A^{(i)} =$  "correct child of  $G_B^{(i-1)}$ "

else let  $U = \text{least-common-ancestor}(S_A^{(i-2)}, G_B^{(i-1)})$

if  $U = S_A^{(i-2)} \Rightarrow S_A^{(i)} = S_A^{(i-2)}$  ← (LCA)

else Backtrack two steps

$$(|S_A^{(i)}| = |S_A^{(i-2)}| - 2)$$

Analysis:  $\phi_i = |U^{(i)}| - (|S_A^{(i)}| - |U^{(i)}|) - (|S_B^{(i)}| - |U^{(i)}|)$

Where  $U^{(i)} = \text{LCA}(S_A^{(i)}, S_B^{(i)})$

Claims: (1)  $\forall i \phi_i \geq \phi_{i-1} - \text{const}$

(2) For "good"  $i$ ;  $\phi_i \geq \phi_{i-1} + \text{const}$ .

(3) Fraction of "bad"  $i \rightarrow 0$  as fraction of errors  $\rightarrow 0$ .

$i$  is  $\epsilon$ -good if  $\forall j \in [1 \dots i]$ ,

~~# errors~~  $\Delta(a_{j:i}, b_{j:i}) \leq \epsilon \cdot (i-j+1)$

Proofs: (1) By definition + construction

(2) if  $i$ -good then (i)  $G_B^{(i)} = S_B^{(i)}$  (~~By~~ if Tree code decodes  $\epsilon$ -fraction)

(ii) so if  $S_B^{(i)} = \text{child}(S_A^{(i-1)})$

then  $|U^i| = |S_A^{(i-1)}| + 1$  &  $|U^i| \geq |U^{i-1}| + 1$

So we make progress on  $|U|$  part.

(iii) if  $S_B^{(i)} \neq \text{child}(S_A^{(i-1)})$

we shrink one of

$|S_A^i| - |U^i|$  or  $|S_B^i| - |U^i|$   
& don't decrease  $|U^i|$

(3) Simple counting... every error hurts  $(\frac{1}{\epsilon})$   $i$ 's.

$\Rightarrow \tau$  fraction errors  $\Rightarrow \left(\frac{\tau}{\epsilon}\right)$  bad  $i$ 's.

$\downarrow$   
0 as  $\tau \rightarrow 0$ .

Conclusion: at end  $\phi_{sn} \geq n \Rightarrow |U| \geq n \Rightarrow A \& B$   
agree on leaf of  $T$ .



## Summary of Schulman Solution

- ① Corrects  $\Omega(1)$ -fraction error ✓
- ② But not maximal-fraction ✗
- ③ Non-constructive: - Tree Codes "exist"  
- Decoding - Brute Force

## Current State of Art

- ① Exact capacity (even with random errors) unknown.
- ② Maximal Fraction Errors essentially known  
[Braverman-Rao, ...]
- ③ Rate as error  $\rightarrow 0$  essentially known.

error =  $\epsilon \rightarrow 0 \Rightarrow$  Rate  $\approx 1 - \tilde{O}(\sqrt{\epsilon})$

[Kol, Raz]  
[Haeupler]

in contrast to  
 $1 - \tilde{O}(\epsilon)$   
for  $q$ -way  
interaction

- ④ Polynomial time encoding + decoding essentially known

[Bakker, Kalai, ...]