

LECTURE 3: RANDOMIZED COMMUNICATION COMPLEXITY

So far, Alice & Bob computationally all powerful, but deterministic. What if they are allowed to use randomness ("toss coins")?

Communication transcript ~~is~~ on (x, y) becomes a random variable

Output also r.v.

Several different flavours

(1) ERROR

- (a) "Las-Vegas protocols" always correct
- (b) "Monte-Carlo protocols" correct with high prob.
- (c) One-sided error: Always correct when $f(x, y) = 0$, say, and correct w.h.p. when $f(x, y) = 1$.

(2) RANDOMNESS

- (a) private-coin: Alice has her private random string r_A and Bob has r_B
- (b) public-coin: Alice & Bob see the same common random string

(3) COST on input (x, y) for fixed protocol P

- (a) worst-case over all choices of random strings
- (b) average-case expected cost.

Note that average case is over random strings for fixed input (x, y) , not over inputs.

We will focus on:

(2)

1(b) Monte-Carlo with two-sided error

2(b) public-coin, although will briefly discuss also private coin.

[Difference not too big - pset 1 will ask you to figure out part of this.]

3(a) worst case cost

[Doesn't really matter - again see pset]

DEF 1

$R_{\epsilon}^{\text{pub}}(f)$: Worst case cost over all inputs for best two-sided error public-coin randomized communication protocol P for f s.t.

$$\Pr[P(x,y) \neq f(x,y)] \leq \epsilon$$

with prob taken over random coin tosses only.

$R_{\epsilon}^{\text{priv}}(f)$: Same thing, but for private coins.

If we just write R_{ϵ} , we mean public coin.

Error parameter ϵ ^{$< 1/2$} / doesn't matter too much as long as it is bounded away from $1/2$

Ex 2 EQ with private-coin protocol

Alice gets input $a = a_0 a_1 \dots a_{n-1}$

Bob $\dots$ $b = b_0 b_1 \dots b_{n-1}$

think of a & b as polynomials over $GF[p] = \mathbb{F}_p$
for $n^2 < p < 2n^2$ prime (must exist)

$$\begin{aligned} a(x) &= a_0 + a_1 x + \dots + a_{n-1} x^{n-1} \pmod{p} \\ b(x) &= b_0 + b_1 x + \dots + b_{n-1} x^{n-1} \pmod{p} \end{aligned}$$

[say smallest such p for concreteness]

Alice picks ^{uniformly} random $c \in \mathbb{F}_p$ and sends Bob
 c and $a(c)$ $O(\log p) = O(\log n)$ bits

Bob evaluates $b(c)$ and outputs 1 if $a(c) = b(c)$
and 0 otherwise.

If $a = b$, clearly answer always 1
(so one-sided error).

If $a \neq b$ polynomials $a(x)$ & $b(x)$
are different.

$a(x) - b(x)$ is non-zero poly of degree $\leq n-1$

$\Rightarrow$ at most $n-1$ zeros

$\Rightarrow a(c) = b(c)$ on at most $\frac{n-1}{p} \leq \frac{n}{n^2} = 1/n$

points. So error probability $\leq 1/n$

Hence $R_{1/n}^{\text{mv}}(\text{EQ}) = O(\log n)$

(Recall $D(\text{EQ}) = n+1$.)

Ex 3 EQ with public-coin protocol

(4)

Joint n -bit random string $r = r_0 r_1 \dots r_{n-1}$

Alice computes inner product

$$\langle a, r \rangle = \sum_{i=0}^{n-1} a_i r_i \pmod{2}$$

and sends to Bob. Bob checks whether

$\langle a, r \rangle = \langle b, r \rangle$ and if so outputs 1 for equal, else 0 for not equal.
2 bits of communication.

If $a = b$, clearly answer always 1
(so again one-sided error).

Suppose $a \neq b$; let j be a position such that

$a_j \neq b_j$, say $a_j = 1$ $b_j = 0$

Consider value of $\sum_{i \neq j} a_i r_i$ and $\sum_{i \neq j} b_i r_i$

If they are equal, w prob $= 1/2$ $r_j = 1$ and
so will flip $\sum_i a_i r_i$

If they are not equal, w prob $= 1/2$ $r_j = 0$
and they stay distinct. So error prob $= 1/2$

Repeat twice $\Rightarrow$ error prob $= 1/4 < 1/2$.

So $R_{1/4}^{\text{pub}}(\text{EQ}) \leq 4$.

Some facts

Fact 4 For ^{private-coin} Las-Vegas protocols (zero error), using worst-case cost just gives us back deterministic CC.

This is so since a deterministic protocol can just fix r_A and r_B and then run the "randomized" protocol

Prop 5 $R_{\epsilon}^{\text{priv}}(f) = \Omega(\log \mathbb{E} D(f))$.

Proof Skipped because of time constraints.

For public-coin protocols, we can view them as distribution $\{P_r\}_{r \in \Pi}$ over deterministic protocols, where r is chosen randomly acc to Π and Alice & Bob then follows deterministic P_r . Useful to define it this way

DEF 6 A RANDOMIZED PUBLIC-COIN PROTOCOL is a probability distribution over deterministic protocols.

The success probability on input (x, y) is the prob of choosing a (deterministic) protocol acc to distr Π such that $P(x, y) = f(x, y)$. Then

$R_{\epsilon}^{\text{pub}}(f)$ [or just $R_{\epsilon}(f)$] is the min cost of a public-coin protocol that computes f with success prob $\geq 1 - \epsilon$.

DISTRIBUTIONAL COMPLEXITY

(6)

Technique to prove lower bounds for randomized protocols with 2-sided error.
Consider random inputs to be acc to some probability distribution.

DEF 7 Let μ be a prob distr on $X \times Y$.
The (μ, ϵ) -DISTRIBUTIONAL COMMUNICATION COMPLEXITY OF f , denoted $D_{\epsilon}^{\mu}(f)$ is the cost of the best deterministic protocol P that gives the correct answer for f for at least an $(1-\epsilon)$ fraction of all inputs in $X \times Y$ weighed by μ , i.e. s.t.

$$\Pr_{(x,y) \sim \mu} [P(x,y) \neq f(x,y)] \leq \epsilon.$$

EX 8 Let unif denote the uniform distribution.
~~Recall~~ Let $\text{GT}(x,y) = [x > y]$

$$D_{1/4}^{\text{unif}}(\text{GT}) \leq 2.$$

Alice sends Bob most significant ^{x_{n-1}} bit of x
Bob compares with y_{n-1}

If $x_{n-1} \neq y_{n-1}$, Bob knows the answer
this happens w prob $1/2$.

If $x_{n-1} = y_{n-1}$, Bob answers 0, say.
This happens for the other half of inputs
and is correct w prob $1/2$. Total success prob
 $3/4$.

Distributional comm cplx LB completely determines public-coin comm cplx

Theorem 9 [Yao '83]

$$R_{\epsilon}^{\text{pub}}(f) = \max_{\mu} D_{\epsilon}^{\mu}(f)$$

Proof of $\geq$ direction: Let P protocol achieving cost $R_{\epsilon}^{\text{pub}}(f)$. P correct for every input w prob $> 1 - \epsilon$

$$\text{Thus } \Pr_{r \sim \Pi, (x,y) \sim \mu} [P_r(x,y) = f(x,y)] > 1 - \epsilon$$

This is = [just by switching order of summation]

$$\sum_{r^*} \Pr[r^* = r] \Pr_{(x,y) \sim \mu} [P_{r^*}(x,y) = f(x,y)] = (*)$$

If $(*) > 1 - \epsilon$, then in particular must exist some fixed r^* s.t.

$$\Pr_{(x,y) \sim \mu} [P_{r^*}(x,y) = f(x,y)] > 1 - \epsilon$$

This protocol P_{r^*} shows that

$$D_{\epsilon}^{\mu}(f) \leq R_{\epsilon}^{\text{pub}}(f).$$

For $\leq$ direction we need a small detour into zero-sum games.

2-PLAYER ZERO-SUM GAMES

8

Player 1 & 2 make moves simultaneously,
and outcome determined by combination of moves.

Player 1 has m possible moves

Player 2 has n possible moves.

$(m \times n)$ - matrix A determines outcome

If P1 chooses i & P2 chooses j ,

P2 has to pay P1 A_{ij} (might be positive or negative)

Randomized strategies column vectors

for P1 disto σ on rows

for P2 disto μ on columns

With prob $\sigma_i \cdot \mu_j$ pay-off is A_{ij}

Sum over all i, j to get expected pay-off.

This is $\sigma^T A \mu$

P1 wants to maximize this

P2 wants to minimize this

The Minimax thm by [von Neumann '28]

says that there are optimal mixed strategies

One of the players can announce his/her strategy
and the other one respond adversarially, and
it doesn't matter.

THM 10

$$\max_{\sigma} \min_{\mu} \sigma^T A \mu = \min_{\mu} \max_{\sigma} \sigma^T A \mu$$

Proof of $\leq$ direction

(9)

Player 1 chooses determ prot P of cost $\leq c$
for $c = \max_{\mu} D_{\epsilon}^{\mu}(f)$

Player 2 chooses $(x, y) \in X \times Y$.

Pay-off for P1 is 1 if $P(x, y) = f(x, y)$
0 otherwise.

[Want to prove $\exists$ randomized protocol of cost c that works for all $(x, y) \in X \times Y$ with prob $> 1 - \epsilon$.]

Whatever the μ chosen by Player 2, Player 1 can find a deterministic protocol that works w prob $\geq 1 - \epsilon$ wrt μ .

Let σ be strategy with coordinate 1 for this μ and 0 elsewhere. Shows

$$\min_{\mu} \max_{\sigma} \sigma^T A \mu \geq 1 - \epsilon.$$

By Minimax thm $\max_{\sigma} \min_{\mu} \sigma^T A \mu \geq 1 - \epsilon$

that is, $\exists$ distr σ over deterministic protocols that works w prob $\geq 1 - \epsilon$ for any distr μ .

In particular, for distr putting all probability mass on a single (x, y) . i.e., we found a distr of our determ prot that succeeds w prob $\geq 1 - \epsilon$
In worst case = randomized prot acc to Def 6.

QED.

DISCREPANCY

(10)

Recall for deterministic comm cplx, we showed that if for function f matrix M_f (with $M(x,y) = f(x,y)$) has no large monochromatic rectangles, then # rectangles in partition of $X \times Y$ large

$\Rightarrow D(f)$ large

For distr CC, we say that rectangle $S \times T$, $S \subseteq X$, $T \subseteq Y$, is "unbalanced" if it is mostly 1s or mostly 0s wrt μ . To show large distributional comm cplx, sufficient to show that unbalanced rectangles must be small.

(If a protocol is mostly correct wrt μ , then intuitively most rectangles should be unbalanced.) More formally:

DEF 11 $f: X \times Y \rightarrow \{0,1\}$ function,
 R rectangle, μ prob distr on $X \times Y$
The DISCREPANCY of f on R under μ is

$$\text{Disc}_\mu(R, f) =$$

$$\left| P_\mu[(x,y) \in R \text{ and } f(x,y) = 0] - P_\mu[(x,y) \in R \text{ and } f(x,y) = 1] \right|$$

The DISCREPANCY of f according to μ is

$$\text{Disc}_\mu(f) = \max_R \text{Disc}_\mu(R, f)$$

where max taken over all rectangles R .

LEMMA 12

For every function $f: X \times Y \rightarrow \{0, 1\}$, every prob disto μ on $X \times Y$, and every $\epsilon \in (0, 1/2)$, it holds that

$$D_{\frac{1}{2} - \epsilon}^{\mu}(f) \geq \log_2 \left(\frac{2\epsilon}{\text{Disc}_{\mu}(f)} \right)$$

So if we can prove strong upper bounds on discrepancy, then we get strong lower bounds on public-coin communication cplx.

Proof Let $\mathcal{P}$ protocol of cost c that computes f correctly w prob $\geq 1/2 + \epsilon$ (wrt μ)
Then we can upper bound the extra advantage ϵ over "random guessing" as follows.

$$\text{By } 2\epsilon = \left(\frac{1}{2} + \epsilon \right) - \left(\frac{1}{2} - \epsilon \right)$$

$$= \Pr_{\mu} [\mathcal{P}(x,y) = f(x,y)] - \Pr_{\mu} [\mathcal{P}(x,y) \neq f(x,y)]$$

$$= \sum_{\text{leaf } l \text{ of protocol } \mathcal{P}} \left(\Pr_{\mu}[(x,y) \in R_l \text{ and } \mathcal{P}(x,y) = f(x,y)] \right.$$

$$\left. - \Pr_{\mu}[(x,y) \in R_l \text{ and } \mathcal{P}(x,y) \neq f(x,y)] \right) = +$$

For each leaf l $\mathcal{P}$ gives a specific output 0 or 1, and clearly picking the more likely answer wrt μ is the best strategy.

Hence

$$(\dagger) \leq \sum_{\substack{\text{leaf } l \\ \text{of } P}} \left| P_{\mu}[(x,y) \in R_l \text{ and } f(x,y)=0] - P_{\mu}[(x,y) \in R_l \text{ and } f(x,y)=1] \right| \\ = (\ddagger)$$

Each term in $(\ddagger)$ is bounded from above by $\text{Disc}_{\mu}(f)$ by definition.

At most a total of 2^C leaves = terms

So

$$(\ddagger) \leq 2^C \text{Disc}_{\mu}(f)$$

That is,

$$2^C \geq \frac{2\varepsilon}{\text{Disc}_{\mu}(f)}$$

or taking logarithms

$$C \geq \log_2 \left(\frac{2\varepsilon}{\text{Disc}_{\mu}(f)} \right).$$

No examples today...

Will return to related ideas in future lectures