

- Non-uniform classes = TMs with advice
- Circuits, Formulae, Branching programs.
- Formulae  $\leq$  BPs  $\leq$  Branching programs
- Depth and Width; Formula depth to size relationship.
- Quadratic lower bound on formula size (Neciporuk).
- Barrington's result on bounded-width branching programs.

- One way to view non-uniform computation, is in the form of a two input Turing machine.
  - $M(x, y)$  in class say  $\mathcal{C}$ .
  - $M$  decides  $L$  with advice  $a = \langle a_1, \dots, a_n \dots \rangle$  if for every  $x \in \{0, 1\}^n$   $M(x, a_n) = 1 \Leftrightarrow x \in L$ .
  - If  $|a_n| = \ell(n)$ , then  $L$  said to be in  $\mathcal{C}/\ell$ .
- Most important subcase:  $P/\text{poly} = \text{polysize circuits} = \text{non-uniform polytime}$ .

## Recall other non-uniform measures

- Formula: Circuits whose DAG is a tree.
- Branching programs: Diff. model of computation, where nodes represent decisions to be taken, and end point determines answer.
- Circuits: Fully powerful non-uniformity.

## Formulae, BPs, Circuits

- $f$  has formula size  $s(n)$  implies  $f$  has BP size at most  $O(s(n))$ .
  - By induction:  $f_1$  and  $f_2$ ,  $f_1$  or  $f_2$ ,  $\overline{f_1}$ .
- $f$  has BP size  $s(n)$  implies  $f$  has circuit size at most  $O(s(n))$ .
  - Induction on size of BP; note that declaring any other node of BP to be start node gives BP of smaller size. Assume there is a circuit of size  $c \cdot (s - 1)$  computing all other functions. Now to compute start node, will add  $c$  extra nodes. Note BP  $f$  can be written as  $x_1 \cdot f_1 + \overline{x_1} \cdot f_2$ .

- Formula size lower bounds: Best known over any basis  $\tilde{\Omega}(n^3)$  or so. Will show an  $\tilde{\Omega}(n^2)$  lower bound today.
- BP size - slightly behind.
- Circuit size: Only  $4.5n$ , over AND, OR, NOT basis.
- Easy to show existence of functions that need size  $2^{\Omega n}$ .

- $f$  is the Distinctness function.
  - $f$  takes  $n\ell$  bits as input. (Will later set  $\ell = 2 \log_2 n$ .)
  - View input as  $X_1, \dots, X_n$  where  $X_i = \langle x_{i,1}, \dots, x_{i,\ell} \rangle$ .
  - $f(X_1, \dots, X_n) = 1$  iff  $\exists i \neq j$  s.t.  $X_i = X_j$ .
  - Thm:  $f$  needs formulae of size at least  $\Omega(n^2)$ , provided  $\ell \geq 2 \log_2 n$ .

## Proof

## Moving on

- Basic ideas: Counting, and restrictions.
- Claim 1: Number of leaves involving variables from  $X_i$  is at least  $\Omega(n)$ .
  - \* Assume o.w. Let  $\#$  leaves =  $k$ .
  - \* Then  $\#$  formulae obtained by restricting other variables to 0/1 is at most  $2^{O(k)}$ .
  - \* But  $\#$  functions obtained by other restrictions is at least  $\binom{2^\ell}{n-1}$ .

- Size lower bounds very weak in unrestricted case. So restrict models and then prove strong lower bounds.
- Example: consider monotone functions (changing input bit from 0 to 1 can not change output from 1 to 0), and prove lower bounds for circuits without negation.
- Example: Restrict "depth" of circuit/BP, "width" of branching program.

- Depth of DAG = length of longest path in DAG.
- Width of Layered DAG:
  - \* DAG is layered if vertices are partitioned into layers  $L_1, \dots, L_k$  and all edges run from  $L_i$  to  $L_{i+1}$ .
  - \* Width of Layered DAG is max number of vertices in Layer.
- Can define width of unlayered DAG also, but not as clean.

- Depth of circuit = parallel time; Can even allow unbounded fan-in OR/AND, to simulate CRCW models.
- Circuit depth = formula depth.
- Formula depth =  $\Theta(\log \text{Formula size})$ .
- Thus Formula size  $\text{poly}(n) = \log n$  depth.
- In upcoming lecture: Show limitations of poly size circuit of constant depth (with unbounded fan-in OR/AND).
- Depth of BP = time. (Size = space).

- Major recent breakthrough: Ajtai shows explicit functions requiring nearly linear space to be done in nearly linear time. (Won't cover.)

### Basic observations about width

- Width of BP = non-uniform space.
- Fair amount of intuition obtained by unravelling DFAs. (DFA unravelling leads to Layered read-once branching program.) Thus  $O(1)$ -width BPs can count modulo  $O(1)$ .
- Early belief: possibly can't do anything else. Can't compute majority?
- Easy to rule out poly size width-2 BPs computing majority. Hard result: width-3 BPs can't compute majority. Hope in the 80s ... will eventually rule out all  $O(1)$  width (or even sublinear width).

## Barrington's Theorem

- Hopes crashed by beautiful result of Barrington: uses insight from group theory, and the existence of non-Abelian groups.
- Our proof: algebraic - due to Ben-Or+Cleve.

- Every function with poly size formula can be computed with width 5 bp.
- Ben-Or Cleve Proof:
  - wlog: prove for log-depth arithmetic formula. (Why does this suffice? Exercise!)
  - Prove for 3-register machines = width 8 bps. (slightly weaker).

## Define Register Machines

## Ben-Or + Cleve proof of Barrington