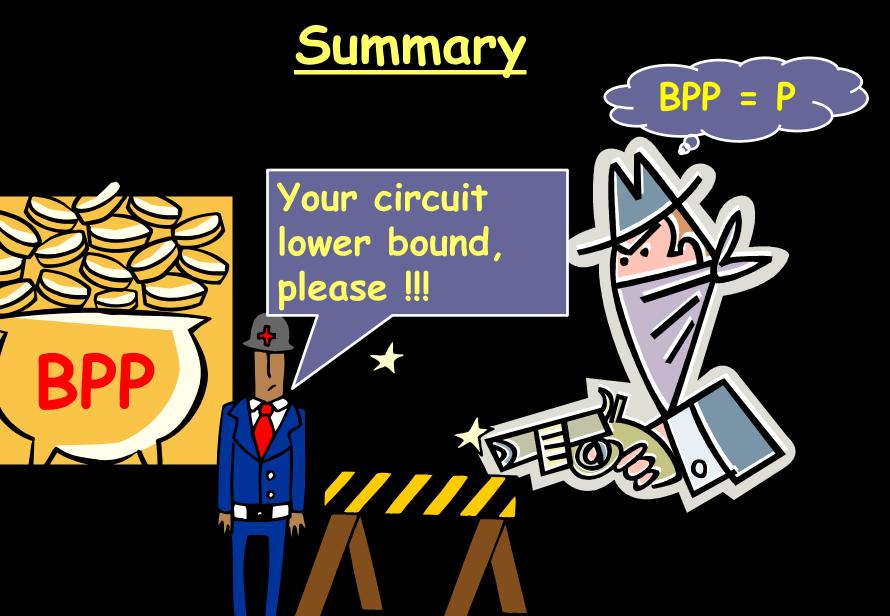
Derandomization vs. Circuit Lower Bounds

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#### **Derandomization**

# Goal: Do efficiently deterministicaly what we can do efficiently probabilistically.

Impossible in general: - crypto, - comm. complexity, ...

#### **Our Focus:**

- Randomized decision algorithms
- Randomized search algorithms

## Decision: BPP vs. P Poly Id Testing:

Given arithmetic circuit C, decide if C computes identically zero polynomial.

Search: Construct "random-like" combinatorial objects

- expander graphs,
- error-correcting codes,
- truth tables of hard Boolean functions

# Decision: BPP vs. P Poly Id Testing:

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#### **Constructing Hard Functions**

#### s(n) - Hardness Generator :

Given n, output a binary string of length 2<sup>n</sup> which (as n-variate Boolean function) has circuit complexity at least s(n). The running time should be poly(2<sup>n</sup>).

Trivial: Randomized 2<sup>n</sup>/n-Hardness Generator exists (may produce an easy string).

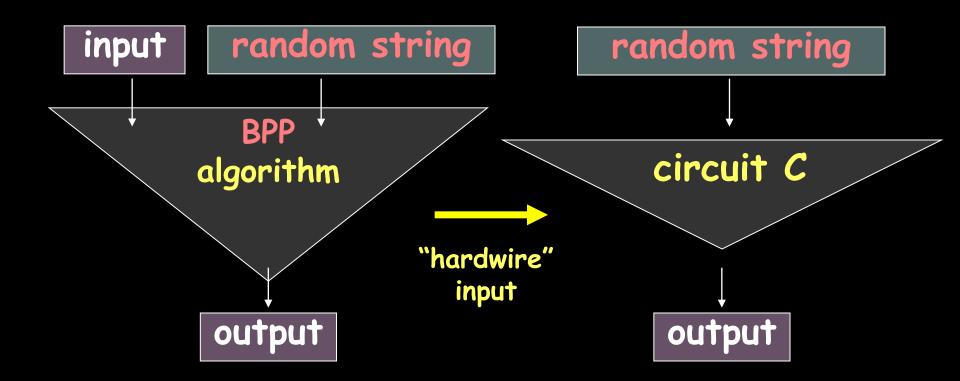
#### Hardness Generator (HG)

- Deterministic s(n)-Hardness Generator exists iff E has circuit complexity at least s(n).
- Open: for  $s(n) > \omega(n)$ .
- Also open:
  - Nondeterministic HG,
  - Zero-Error Randomized HG, ...

# Hardness Generation vs.

## Derandomization of BPP

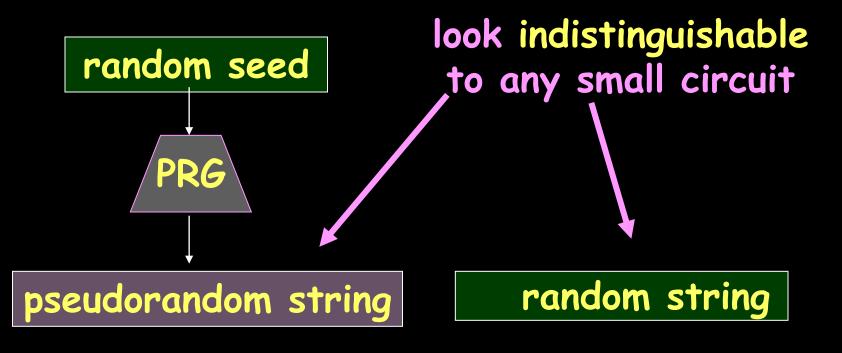
### <u>From BPP algorithms to</u> <u>Boolean circuits</u>



Want to estimate the acceptance probability of circuit C (or find an accepted string, if C accepts many strings).

# PseudoRandom Generator (PRG)

**Definition** [Nison, Wigderson]: s(n)-PRG is a function G:  $\{0,1\}^n \rightarrow \{0,1\}^{s(n)}$ , with output distribution indistinguishable from uniform by any s(n)-size circuit; G is computable in time  $2^{O(n)}$ .



# Hardness Generators yield

### Pseudorandom Generators

## **Incompressibility** Argument



Each  $r \in B$  has "small" description relative to  $C: \log |B|$  bits specifying the rank of r in B, plus the description of C (common to all r in B)

Corollary: Any string incompressible relative to C is accepted by C.

# **Incompressibility** Argument



Assume:  $|B| < 2^n/n$ , and |C| < n. Let R be any incompressible  $n^2$ -bit string. Partition R into n-bit strings  $r_1, ..., r_n$ .

Claim: At least one  $r_i$  is accepted by C.

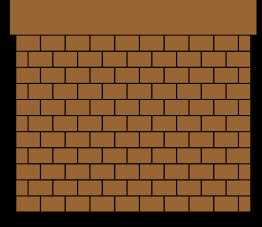
Proof: Else R is described by < n (n - log n) + n <  $n^2$ bits. QED

# **Incompressibility** Argument

Problem: Generating incompressible strings is algorithmically impossible ! (by definition)

[Nisan,Wigderson'88]: Enough to generate strings of HIGH CIRCUIT COMPLEXITY !!!





#### <u>Hardness-Randomness</u> <u>Tradeoffs</u>

[NisanWigderson, BabaiFortnowNisanWigderson, Impagliazzo, ImpagliazzoWigderson, ImpagliazzoShaltielWigderson, SudanTrevisanVadhan, ShaltielUmans, Umans, ...]:

> Deterministic s(n)-Hardness Generator yields s(n)-Pseudorandom Generator,

> > and vice versa.

Thm: s(n)-HG exists iff s(n)-PRG exists

Can we prove BPP = P without proving circuit lower bounds ?

#### <u>BPP=P implies circuit lower bounds</u>

- Thm [K., Impagliazzo]:
- If BPP = P, then
  - either NEXP not in P/poly,
    - or Permanent does not have polysize arithmetic circuits.

Why should a fast (deterministic) algorithm (for BPP) lead to any circuit lower bounds?



# $\frac{\text{Constructing a hard function}}{\text{from P = NP}}$

Thm [Kannan]: There is a  $2^n/n$  - Hardness Generator computable in Time( $2^{O(n)}$ ), given  $\Sigma_3$  oracle.

Proof Idea: Use alternating quantifiers to express "f is the first truth table not computable by any small circuit". QED

Corollary:  $P=NP \Rightarrow \exists$  deterministic  $2^n/n-HG$ ( $\Leftrightarrow E$  has language of  $2^n/n$  circuit complexity)

#### <u>How to construct a hard</u> <u>function</u>

- 1. By diagonalization, construct a hard function in a "large" complexity class.
- Using an efficient meta-algorithm, collapse the "large" class to a "smaller" class.

<u>How to construct a hard</u> <u>function: Application</u>

1. By diagonalization, construct a hard function in a "large" complexity class.

#### $E^{\Sigma_3}$ has $2^n/n$ circuit complexity

2. Using an efficient meta-algorithm, collapse the "large" class to a "smaller" class.

#### $\mathsf{P} = \mathsf{N}\mathsf{P} \implies \mathsf{E}^{\Sigma_3} = \mathsf{E}$

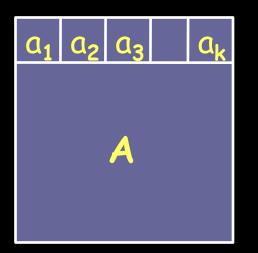
# $\frac{Constructing a hard function}{from BPP = P}$

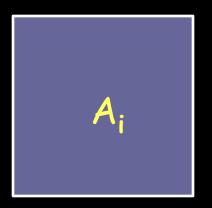
Meta-problem: Poly Identity Testing (PIT).

Main Observation: If PIT in P, then can test in P if a given arithmetic circuit computes Permanent.

(downward self-reducibility of Perm)

#### <u>Downward self-reducibility of Perm</u>





i<sup>th</sup> minor of A along 1<sup>st</sup> row

Perm (A) =  $\Sigma_i$   $a_i * Perm (A_i)$ 

#### Polynomial Identities for Perm

Let  $C_1, ..., C_n$  be arithmetic circuits, where  $C_k$  has  $k^2$  input variables.

The circuits C<sub>1</sub>, ..., C<sub>n</sub> compute Permanent iff
C<sub>1</sub>(x) = x, and
∀ 1 < k ≤ n, and k×k matrix X = [x<sub>i,j</sub>] of variables,

$$C_{k}$$
 (X) =  $\Sigma_{i=1..k}$   $X_{1,i} * C_{k-1}$  (X<sub>i</sub>),

where  $X_i$  is X without  $1^{st}$  row and  $i^{th}$  column.



# If PIT in P, then can test in P if a given arithmetic circuit computes Permanent.

#### <u>Constructing a hard function</u> <u>from PIT in P</u>

Assume PIT in P, and Perm has polysize arithmetic circuits. Then  $P^{Perm} \subseteq NP$ .

Corollary 1:  $P^{\#P} \subseteq NP$ . [Valiant]

Corollary 2:  $PH \subseteq P^{\#P} \subseteq NP = coNP$ . [Toda]

Corollary 3: E<sup>PH</sup> = NE = coNE requires 2<sup>n</sup>/n circuit size. <u>Thanks [Aaronson, van Melkebeek]</u>.

#### Derandomization of PIT from Arithmetic Circuit Lower Bounds

Thm [K., Impagliazzo]: If Perm requires arithmetic circuits of size  $2^{n^{\epsilon}}$  (over rationals), then PIT  $\in$  DTIME ( $n^{polylog n}$ ).

Hitting set H for poly(n)-size n-variate arithmetic circuits (computing poly(n)-deg polynomials):

 $H = \{ (Perm(a_{i,1}), ..., Perm(a_{i,n}) \} :$ 

 $a_{i,j} \in [n^{c}]^{d \log n}$  chosen using the NW design }

# PIT is easy iff

## can prove circuit lower bounds

## <u>Meta-algorithms vs. Lower</u> <u>Bounds</u>

Meta-algorithm = an algorithm that takes algorithms as input (e.g., SAT, Poly Id Test, ...)

Zane's thesis: Progress on meta-algorithms is linked to progress on lower bounds.

LinialMansourNisan, PaturiPudlakSaksZane, RazborovRudich, NisanWigderson, Braverman, ...

# Constant Depth

#### PIT for constant-depth circuits

[DvirShpilkaYehudayoff]: Derandomization iff lower bounds (similar to [KI])

Depth-3 derandomization (bounded top fanin): [DvirShpilka, KayalSaxena, ArvindMukhopadyay, KarninShpilka, SaxenaSeshadri, KayalSaraf, ...]

Challenge: Depth-3 circuits (unbounded fanin)

[Raz'09]:
Exponential depth-3 formula lower bounds ⇒
superpoly (any depth) formula lower bounds
⇒ general Formula-PIT ∈ ??? time

[AgrawalVinay]: Exponential depth-4 circuit lower bounds ⇒ exponential (any depth) circuit lower bounds ⇒ general Circuit-PIT ∈ n<sup>polylog n</sup> time

<u>PIT from constant-depth lower</u> <u>bounds</u>

# Derandomization without circuit lower bounds ?

# Weak Derandomization without circuit lower bounds ?

#### Typically-correct derandomization

Relaxation: Allow derandomized algorithms to make mistakes on "few" inputs.

#### [Impagliazzo, Wigderson '01]:

A language L is in Heur-P if there is a determistic polytime algorithm A s.t.  $\Pr_{x \leftarrow D} [A(x) \neq L(x)]$  is "small", for any polytime-sampleable D.

[Goldreich, Wigderson '02]: D = Uniform



[Impagliazzo, Wigderson '01]:  $EXP \neq BPP \implies BPP \subseteq io-Heur-SUBEXP.$ 

Cf. [BabaiFortnowNisanWigderson]: EXP not in P/poly  $\Rightarrow$  BPP  $\subseteq$  io- SUBEXP

" EXP ≠ BPP " is not known to imply any circuit lower bounds ...

Cf. [IKW]: NEXP  $\neq$  MA  $\Leftrightarrow$  NEXP not in P/poly

Typically-correct derandomization [IW'01, K'01, TV'07, GSTS'03, SU'07, GW'02, Zim'08, Sha'09, KMS'09]

[Kinne, Melkebeek, Shaltiel'09]: Under assumption (\*), every BPP language has a P-algorithm that is correct on almost all inputs (of every length).

Assumption (\*): P has a language that is average-hard for n<sup>d</sup>-size circuits.

#### <u>Typically-correct derandomization</u> <u>and circuit lower bounds</u>

- [Kinne, Melkebeek, Shaltiel'09]: If every BPP language has a SUBEXP-algorithm that is correct on all but subexp-many inputs, then
  - either NEXP not in P/poly,

or Perm is not computable by polysize arithmetic circuits.

(extends [KI'04] to "typically-correct" setting.)

# More on Hardness

# Hardness Testing

- Given a binary string x, test if x has "high" circuit complexity.
- Sound test accepting "many" strings is unlikely in P ("natural property" [RazborovRudich]).



- Sound test accepting "few" strings ?
- [IKW'02]:  $\exists$  sound test in NP  $\Rightarrow$  NEXP not in P/poly.
- That is, NP-constructivity  $\Rightarrow$  lower bounds



Strongly exponential arithmetic circuit lower bounds  $\Rightarrow$  PIT  $\in$  P ?

Strong arithmetic formula lower bounds  $\Rightarrow$  derandomization of Formula-PIT?

 BPP ≠ EXP ⇒ circuit lower bounds ? (extending [KM5'09] ???)

