**Today** 

• NP  $\subseteq$  PCP[ $O(\log n)$ , poly  $\log n$ ].

Defined PCP.

• Verifier is probabilistic. Tosses r(n) coins.

Last time

 Verifier interacts with an oracle (i.e., has random access to a proof string). Makes q(n) queries.

 Accepts valid proofs with probability > c(n). (I.e., if  $x \in L$ , there exists  $\pi$  s.t. ...)

 Accepts invalid theorems with probability  $\leq s(n)$ . (I.e., if  $x \notin L$ , for all  $\pi$  ...)

•  $PCP_{c,s}[r,q]$  class of such languages L.

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• One subscript implies c=1 suppressed.

• Zero subscripts implies c = 1, s = 1/2.

Last time (contd.)

Mentioned best known result:  $NP \subset$  $\mathsf{PCP}_{1,\frac{1}{2}+\epsilon}[O(\log n),3]. \ \ [\mathsf{Hastad}].$ 

 Consequence: Approximating MAX SAT to within  $15/16 + \delta$ , for any  $\delta > 0$  is NP-hard.

• Today: A simpler PCP theorem.

# Main ingredients

- NP hardness of an algebraic problem.
- PCP verifier for the algebraic problem.

# Algebraic problem: Polynomial constraint satisfaction

- ullet Constraint satisfaction problems: Generic class of problems.  $x_1,\ldots,x_n$  variables.  $C_1,\ldots,C_t$  constraints (clauses). Goal: Find assignment  $x_i\to a_i$  that satisfies as many constraints as possible.
- Typically, no restriction on assignment.

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#### **PCS**

- n associated with m-dimensional space over some field  $\mathbb{F}$ . I.e.,  $n=|\mathbb{F}|^m$ .
- Assignment is a function  $f: \mathbb{F}^m \to \mathbb{F}$ .
- ullet Constraints are arbitrary functions on f, given by "truth table" or circuit evaluating them.
- ullet Each constraint will apply to  $\operatorname{poly} \log n$  variables.
- Only interested in assignments that are lowdegree polynomials.

#### **PCS**

- Instance:  $(m, \mathbb{F}, d, w; C_1, \dots, C_t)$ , where  $C_j$  given by  $x_1^{(j)}, \dots, x_w^{(j)} \in \mathbb{F}^m$  and  $A^{(j)}: \mathbb{F}^w \to \{0, 1\}$ , given by arithmetic circuit.
- Yes instances: There exists a degree d polynomial  $f:\mathbb{F}^m\to\mathbb{F}$  such that all constraints satisfied.
- No instances: Every degree d polynomial  $f: \mathbb{F}^m \to \mathbb{F}$ , fails to satisfy almost all (90%) constraints.

#### **PCS** claims

Lemma 1: PCS has a PCP verifier that tosses  $O(\log t + m \log |\mathbb{F}|)$  coins, queries the proof  $O(wd \log |\mathbb{F}|)$  times, and has c=1 and  $s=\frac{1}{2}$ .

Lemma 2: SAT on n variables reduces to PCS in time  $|\mathbb{F}|^m$ , for any  $\mathbb{F}, m, d, w$  such that  $\mathbb{F} \geq 100wd$  and  $(d/m)^m \geq n^c$  and  $w \geq d$ .

Comments: Lemma 2 is just an NP hardness result?

- Weaker soundness since it only applies to some assignments.
- Stronger since it gives a gap.

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9

#### **Proof of Lemma 1**

#### PCP Verifier:

- Expects proof oracle to be a degree d polynomial  $f: \mathbb{F}^m \to \mathbb{F}$ .
- Step 1: Test function f is close to some degree d polynomial p. ("Low-degree testing").
- ullet Build oracle for p ("Polynomial self-correction")
- Pick random constraint  $C_j$  and verify if p satisfies  $C_j$ .

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# Missing ingredients in PCP proof

- Hardness of PCS.
- Low-degree testing
- Self-correction of polynomials.

#### **Self-correction problem**

Given oracle  $f:\mathbb{F}^m \to \mathbb{F}$  s.t. there exists a polynomial  $p:\mathbb{F}^m \to \mathbb{F}$  s.t.  $\Pr_{x\in\mathbb{F}^m}[f(x) \neq p(x)] \leq \delta$ .

Given also  $a \in \mathbb{F}^m$ .

Compute p(a).

#### Basic idea: Lines in $\mathbb{F}^m$

Pick random  $r \in \mathbb{F}^m$ .

Look at line  $\ell(t) = (1-t)a + tr$ .

 $p|_{\ell}$  is degree d polynomial.

We want  $p|_{\ell}(0)$ .

 $\ell(t)$  is random point of  $\mathbb{F}^m,$  except if t=0. So  $p_\ell(t)=f(\ell(t))$  w.p.  $1-\delta.$ 

# Self-correction algorithm

- Pick  $r \in \mathbb{F}^m$  at random.
- Let  $\tau_1, \ldots, \tau_{d+1}$  distinct  $\in \mathbb{F}$ .
- Compute h of degree d s.t.  $h(\tau_i) = f((1 \tau_i)a + \tau_i r)$ .
- Output h(0).

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# **Analysis**

- $\Pr_r[\exists i \text{ s.t. } p|_{\ell}(\tau_i) \neq f(\ell(\tau_i))] \leq (d+1)\delta.$
- W.p.  $1-(d+1)\delta$ ,  $h=p|_{\ell}$  and so  $h(0)=p(\ell(0))=p(a)$ .

Above due to [BeaverFeigenbaum, Lipton].

# Low-degree testing

How to test if arbitrary function f is close to some polynomial of degree d?

Run time poly(m, d).

Can't examine whole function.

Can't even write coefficients!

Idea Analysis

If function is close to a polynomial, then its self-correction equals itself at most points. Test this.

# Algorithm:

- Repeat many times:
  - Pick  $a, r \in \mathbb{F}^m$  at random.
  - Let  $\tau_1, \ldots, \tau_{d+1}$  distinct  $\in \mathbb{F}$ .
  - Compute h of degree d s.t.  $h(\tau_i) = f((1 \tau_i)a + \tau_i r)$ .
  - Verify h(0) = f(a).

Non-trivial. Beyond scope of interesting lectures!

Theorem [Rubinfeld-Sudan, ALMSS]: Every iteration gives  $\min\{\delta/c,\gamma\}$  probability of detecting cheating, if f is  $\delta$  far from every degree d poly.

R-S result 
$$\gamma = \Theta(1/d)$$
,  $c = 2$ .

ALMSS : 
$$\gamma>0$$
 , but  $\gamma\sim0$  ,  $c=2.$ 

f-the-art , 
$$c=1+o(1)$$
,  $\gamma=1-o(1)$ , where  $o(1)$  depends on  $d/|\mathbb{F}|$ .

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1

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#### **PCS** hardness

- Skip problem statement for now.
- Will play with proof of #P in IP and define some polynomial straight line programs.
- Will shrinkwrap into hardness of PCS later.

#### Idea

- Arithmetize SAT, and "count" number of clauses unsatisfied. (Not number of satisfying assignments).
- For intuition, think of  $n=2^m$  and  $[n]=\{0,1\}^m$ .
- Given SAT formula  $\phi$ , think of assignment as a function  $A: \{0,1\}^m \to \{0,1\}$ .
- Extend assignment into function  $\hat{A}: \mathbb{F}^m \to \mathbb{F}$  for some appropriate field  $\mathbb{F}$ .

Prop: Every function  $A:\{0,1\}^m \to \{0,1\}$  can be extended into polynomial  $\hat{A}:\mathbb{F}^m \to \mathbb{F}$  of degree one in each variable

Prop: Every function  $A:H^m\to\mathbb{F}$  can be extended into polynomial  $\hat{A}:\mathbb{F}^m\to\mathbb{F}$  of degree |H|-1 in each variable

Idea (contd.)

- Think of  $\phi: \{0,1\}^{3m+3} \to \{0,1\}.$ 
  - Typical clause  $A(i_1)=b_1$  or  $A(i_2)=b_2$  or  $A(i_3)=b_3$ .
  - Specified by  $i_1, i_2, i_3 \in \{0, 1\}^m, b_1, b_2.b_3 \in \{0, 1\}.$
  - $-\phi(i_1,i_2,i_3,b_1,b_2,b_3)=1$  if clause in  $\phi$  and 0 o.w.
- Extend  $\phi$  into  $\hat{\phi}$ .

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# Idea (contd.)

- Arithmetizing satisfiability. Have arithmetized assignment, and input formula. Now will arithmetize satisfying condition.
- SAT :  $\{0,1\}^{3m+3} \to \mathbb{F}$ , SAT $(i_1, i_2, i_3, b_1, b_2, b_3) = \phi(i_1, i_2, i_3, b_1, b_2, b_3) + (A(i_1) - b_1) \cdot (A(i_2) - b_2) \cdot (A(i_3) - b_3)$ .
- Input to SAT clause name. SAT(clause) = 0 if clause not in  $\phi$  or clause satisfied.
- We want to "prove" there exists A such that for every x in  $\{0,1\}^m$  s.t.  $\mathrm{SAT}(x) \neq 0$  is zero.

# Contrast with #P scenario

- m now is  $\log n$  ...
- ullet Have an existential quantifier on A.
- Wanted to prove a sum condition on  $\{0,1\}^m$ , now we have a "for all" condition
- Previously used sum on integers to convert "for all" to sum condition and then used CRT to reduce to finite field question. But this mizes badly with existential quantifier.
- Will redo proof ... that works.

# Polynomial straightline program

- $p_0 = SAT$  on m' variables.
- Will define  $p_1, \ldots, p_{m'}$   $p_i$  defined by simple rule from  $p_{i-1}$ . (I.e. can compute  $p_i$  with oracle access to  $p_{i-1}$ .)
- Goal: If evolved correctly  $p_{m'} \equiv 0$  in complete case, and  $\not\equiv 0$  in unsound case.
- $p_i(y_1, \dots, y_i, x_{i+1}, \dots, x_{m'})$ =  $p_{i-1}(y_1, \dots, 0, x_{i+1}, \dots, x_{m'})$ +  $y_i p_{i-1}(y_1, \dots, 1, x_{i+1}, \dots, x_{m'}).$
- Claim:  $p_{i-1}$  zero on  $\mathbb{F}^{i-1} \times \{0,1\}^{n-i+1}$  iff  $p_i$  zero on  $\mathbb{F}^i \times \{0,1\}^{n-i}$ .

#### **PCS** problem

- Have many polynomials  $\hat{A}, p_0, \ldots, p_{m'+1}$ .
- If there exists  $\hat{A}$  such that application of rules makes  $p_{m'}=0$ , then  $\phi$  is satisfiable.
- But if it is not zero, some rule i is violated, and then a random  $(x_1, \ldots, x_{m'})$  will reveal violation.

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# **PCS** problem instances

- New assignment  $p: \mathbb{F}^{m'+1} \to \mathbb{F}$  polynomial of degree 2m'+1.
- Supposedly  $p(i,x) = p_i(x)$  and  $p(-1,y,z) = \hat{A}(y)$ . (Assume  $-1,0,1,\ldots,m'$  are distinct elements of field.)
- $\begin{array}{l} \bullet \ \mbox{Constraints} \ C_{i,x}: p_i(x_1,\ldots,x_m) \\ = p_{i-1}(x_1,\ldots,x_{i-1},0,\ldots,x_m) \\ + \ x_i p_{i-1}(x_1,\ldots,x_{i-1},0,\ldots,x_m) \ \ \mbox{if} \ \ i \in \\ \{1,\ldots,m'\}; \ p_i(x) = 0 \ \mbox{if} \ \ i = m'+1 \ \mbox{and} \\ p_i(i_1,i_2,i_3,b_1,b_2,b_3)) \ = \ \phi(\ldots)(p_{-1}(i_1) b_1) \ldots (p_{-1}(i_3) b_3) \ \mbox{if} \ \ i = 0. \end{array}$
- Constraint  $C_x = \wedge_i C_{i,x}$ .

# **Analysis**

Completeness: Following the rules leads to all cosntraints being satisfied.

#### Soundness:

- Take polynomial  $p: \mathbb{F}^{m'+1} \to \mathbb{F}$  and let  $A: \{0,1\}^m \to \mathbb{F}$  be restriction of p to first variable =-1 and variables  $m+1,\ldots,m'+1$  being set to 0.
- This assignment fails to satisfy some clause. So application of rules will lead to  $p_{m^\prime}$  being mostly non-zero.
- Prover may cheat on some rule i, but then  $C_{i,x}$  will be violated for most x.

•	No	ma	itter	what	$C_x$	is	mostly	unsatis	fied.
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