#### **PCPs and Inapproximability:**

Recent Milestones and Continuing Challenges

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Intended to be a survey<sup>\*</sup> of some key developments of last  $\approx 10$  years

Let's begin with a glimpse of where PCP theory was  $\approx$  a decade back

#### PCPs circa 2000

#### PCP theorem

- <u>PCP theorem</u>: [AS, ALMSS] Polynomial size witnesses for NP languages that can be checked by a randomized polytime verifier by just probing 3 bits (with soundness error < 0.999)</li>
- Equivalently, Gap3SAT  $_{\rm 1,\alpha}$  is NP-hard for some  $\alpha$  < 1
- (Surprising?) Connection to approximating Clique (based on FGLSS graph) discovered before connection to approximating Max 3SAT
  - PCP theorem implies factor  $n^{\gamma}$  inapproximability for Clique

### PCPs: early years

- PCP theorem implied APX hardness for many problems (via their classic reductions from 3SAT).
  - Generally very weak factors.
  - Quest for better (optimal?) factors followed
- 2-prover 1-round proof systems ("bipartite 2-query PCPs") emerged as the canonical PCP to reduce from:
  - Constraint satisfaction problem called Label Cover
  - Example early Label Cover-based success:

 $\Omega(\log n)$  hardness for set cover [Lund-Yannakakis]

## Label Cover

- Binary (arity two) CSP over large domain [R] with "projection" constraints.
- Instance consists of:
  - Bipartite graph G=(V,VV,E)

- For each  $e = (v, w) \in E$ , a function  $\pi_e : [R] \rightarrow [R]$ .

- Assignment (labeling) A:  $V \cup W \rightarrow [R]$  satisfies an edge e=(v,w) if  $\pi_e(A(v)) = A(w)$ 
  - Value of instance = maximum fraction of edges satisfied by a labeling
- Raz's parallel repetition theorem gives a strong (value 1 vs  $1/R^{\gamma}$ ) gap hardness for Label Cover

# Strong(er)/optimal PCPs

- Improvements in PCP params, aimed in part at better hardness results (using specific predicates for PCP check)
  - Label Cover used as "outer" PCP
  - Composed with "inner" PCP (trading off soundness for much smaller # queries)
    - <u>Paradigm</u>: **Encode** labels & test codewords
    - "Inner" task: Check if π(a)=b reading very few bits of Enc(a) and Enc(b)
- Which code to use?

Brilliant invention of [Bellare-Goldreich-Sudan]: LONG CODE

#### Long Code (aka Dictator functions)

- For  $a \in \{1, 2, ..., R\}$ , LONG(a) :  $\{0, 1\}^R \to \{0, 1\}$ LONG(a)(x) =  $x_a$  for every  $x \in \{0, 1\}^R$ 
  - Very redundant (encodes log R bits into 2<sup>R</sup> bits)
    - has the value of every function  $[\mathbf{R}] \rightarrow \{0,1\}$  at a
    - but doesn't hurt to have around if R is constant.
  - Surprisingly useful!

### The first optimal PCPs

- [Håstad'96]: zero "amortized free bit" PCP  $\Rightarrow$  factor  $n^{1-\varepsilon}$ inapproximability for Clique
- [Håstad'97]: Gap3LIN<sub>1-ε,<sup>1</sup>/2+ε</sub> is NP-hard (3-query PCP) with completeness  $1-\varepsilon$  and soundness  $\frac{1}{2}+\varepsilon$ ). Optimal! Also, similar result mod p, and NP-hardness of **Optimal!** 
  - Gap3SAT<sub>1.7/8+ $\epsilon$ </sub> & Gap-4-Set-Splitting<sub>1.7/8+ $\epsilon$ </sub>
- Several hardness results (currently best known, under NP  $\neq$  P) via gadget reductions from Håstad's results:
  - MaxCut: 16/17 Max2SAT: 21/22 MaxDiCut: 11/12
  - NAE-3SAT: 15/16 3-Set-Splitting: 19/20 3-coloring: 32/33 (these are with perfect completeness)

#### Approximation resistance

- The tight results for CSPs showed "approx. resistance"
   hard to beat naive random assignment.
- An exception: Max 3MAJ
  - 2/3+ $\epsilon$  hardness via reduction from 3LIN
  - Factor 2/3 algorithm [Zwick]
- In parallel with hardness revolution, sophisticated SDP rounding methods developed. Eg.
  - 7/8 algo for Max3SAT [Karloff-Zwick]
  - Factor  $\frac{1}{2}$  algo for Max3CSP and factor 5/8 for satisfiable 3CSP.

#### Optimal PCPs: queries vs soundness

- [G.-Lewin-Sudan-Trevisan] 3-query adaptive PCP with perfect completeness & soundness <sup>1</sup>/<sub>2</sub>+ε
- [Samorodnitsky-Trevisan] 1+ε amortized query complexity: k queries, soundness 2-k+o(k)

 $-2^{-k+o(k)}$  hardness for Max k-CSP.

- Later with perfect completeness [Håstad-Khot]
- Useful starting points in some reductions, eg. Lowcongestion path routing, Clique.

#### Low-soundness Multiprover systems

- [Arora-Sudan; Raz-Safra] O(1) prover 1-round proof systems with  $exp(-(log n)^{\Omega(1)})$  soundness
  - NP-hardness of  $\Omega(\log n)$  factor for set cover
  - Similar result for 2-prover case open
    - Would have more applications, like hardness of lattice problems
- [Dinur-Fischer-Kindler-Raz-Safra] O(1) prover systems with
  - $-\exp(-(\log n)^{0.99})$  soundness.
  - Proof of BGLR "sliding scale" conjecture for up to (log n)<sup>0.99</sup> bits read

### Covering PCPs

- Notion of soundness tailored to coloring problems
  - Covering soundness = minimum number of proofs that can "cover" all constraints (for every check, at least one proof should cause acceptance)
  - [G.-Håstad-Sudan] 4-query PCP with  $\omega(1)$  covering soundness
    - Super-constant hardness for coloring 2-colorable 4-uniform hypergraphs.
    - Later also for 3-uniform hypergraphs [Khot] [Dinur-Regev-Smyth]

# <u>Frontier:</u> Rule out 5-coloring 3-colorable graphs in polytime

### PCPs till ~ 2000 summary

- Label Cover hardness
  - versatile starting point for inapproximability (continues to be prominent)
- Label Cover + Long Code + Fourier analysis paradigm
- Tight hardness results for several CSPs of arity  $\geq 3$
- Arity 2 CSPs not well understood (results only via gadgets)



Low soundness error 2-query PCPs

Short PCPs (n<sup>1+o(1)</sup> size): - Best known n (log n)<sup>O(1)</sup>

PCPs in the last decade New "outer" PCPs - multilayered, smooth, mixing, Dinur-Safra, etc. - <u>Conjectural</u> forms: Unique Games, 2-to-1, ...

#### New proofs, notions:

- Dinur's gap amplification
- Robust PCPs
- PCP of proximity (PCPP)

Dictatorship tests and new "inner" PCPs

- New analytic machinery

#### New proofs and notions

### Dinur's proof

- <u>Gap amplification</u>: Reduce Gap-3Color<sub>1,1- $\delta$ </sub> to Gap-3Color<sub>1,1-2 $\delta$ </sub> provided  $\delta < 10^{-6}$ 
  - Apply O(log n) times starting with  $\delta\text{=}1/\text{m}$
  - Shows that Gap-3Color<sub>1, $\alpha$ </sub> is NP-hard for some constant  $\alpha$ <1 (this implies the PCP theorem)
- PCP via inapproximability instead of other way around
- Requires elements of old PCP in alphabet reduction
  - Constant sized PCP: variant called "assignment tester" that checks if assignment x is close to satisfying circuit C

#### Robust PCPs

PCP soundness: When φ∉ SAT, for all proofs π, with probability ρ, check C<sub>I</sub> rejects π<sub>I</sub> (I=randomly chosen query positions)

Proof π

Check  $C_I(\pi_I) = 1$ 

- Robust PCP: stronger soundness guarantee
  - $-\pi_{I}$  far from satisfying C<sub>I</sub> (with good prob.)
  - Formally,

 $\mathbb{E}_{I}[\Delta(\pi_{I}, \operatorname{SAT}(C_{I}))] > \eta$  (  $\eta$  = robust soundness)

#### Robust PCPs & PCPPs

- Check if  $\pi_1$  satisfies  $C_1$  or is *far* from satisfying  $C_1$ *recursively,* using another "inner" PCP
- Inner primitive: *PCP of proximity* (PCPP)
  - Input: circuit C
  - Proof: (purported) satisfying assignment x and proof of proximity  $\sigma$  that x satisfies C
  - Verifier (Assignment Tester): read few bits in *both* x and  $\sigma$ ;
    - For satisfying x,  $\exists \sigma$  with acc. prob. 1
    - If x is  $\delta$ -far from satisfying C, then  $\forall \sigma$ ,  $\Omega(1)$  rej. prob.
- Useful when proximity parameter  $\delta$  of inner PCPP is <br/> <br/> <br/> robust distance  $\eta$  of outer PCP

### Composition streamlined

- Robust PCPs compose "syntactically" with "inner" PCPs of proximity (when PCPP proximity parameter < robustness)</li>
- [Ben-Sasson, Goldreich, Harsha, Sudan, Vadhan] Can check that original polynomial and Hadamard based PCPs can be made robust PCPPs.
  - Simplifies details of composition
  - Used to give near-linear size PCPs
- PCPP also used in Dinur's alphabet reduction step
  - Explicit coding used to create distance between inconsistent assignments

### Talk Plan

- New proofs and notions
- Robust PCPs and PCPs for proximity
- Short PCPs
- Low-soundness error Label Cover
- Unique Games, Dictatorship tests, etc.
- NP-hardness via structured outer PCPs
- Some challenges

### Quasi-linear PCPs

- [BGHSV] PCPs of length  $n \cdot 2^{(\log n)^{\epsilon}}$  (O(1/ $\epsilon$ ) queries)
- [Ben-Sasson, Sudan] Univariate polynomial based PCP
  - Proof of proximity for Reed-Solomon codes which makes it locally testable
  - n (log n)<sup>O(1)</sup> sized PCP with (log n)<sup>O(1)</sup> queries
  - O(log log n) steps of Dinur's gap amplification gives
    n (log n)<sup>O(1)</sup> sized PCP with O(1) queries
- Implication for approximation: APX-hardness via reduction from 3SAT hold for  $2^{\tilde{\Omega}(n)}$  time algos, under the ETH

#### • New proofs and notions

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#### Label cover with o(1) soundness

- Håstad's 7/8+ε hardness for 3SAT requires soundness error of Label Cover to be << ε</li>
- Getting this via parallel repetition makes Label Cover instance size  $n^{\Omega(\log(1/\epsilon))}$  (with large hidden constant factor)
- Can we get such soundness with LC size say  $O_{\epsilon}(n^3)$ ?

<u>Answer</u>: [Moshkovitz-Raz] YES. In fact, with *near-linear* size ! (Was very surprising to me)

For soundness  $\varepsilon$ , Label Cover with  $n^{1+o(1)} \operatorname{poly}(1/\varepsilon)$  vertices.

• Worse dependence on domain size:  $R = exp(poly(1/\epsilon))$ instead of  $poly(1/\epsilon)$  in Raz. Inapproximability consequence

- 7/8+ $\varepsilon$  approx. for 3SAT requires  $\exp(\Omega_{\epsilon}(n^{1-o(1)}))$ time (under "Exponential Time Hypothesis")
  - constant factor: doubly exponentially small in  $\epsilon$
  - Similar claims for other hardness results based on Label cover + Long code testing
- Sharp complexity dichotomy at the approximation threshold: polytime vs. exponential time.
  - Eg. unlikely that there's a factor  $7/8+\epsilon$  approx. algo for Max3SAT with runtime  $exp(n^{10}\sqrt{\epsilon})$

#### [Moshkovitz-Raz] approach

- Start with Label Cover of low soundness error  $\epsilon$  but large alphabet  $\Sigma$ 
  - $-\epsilon = (\log n)^{-\beta}, |\Sigma| = \operatorname{poly}(n)$  (based on low-degree testing in list-decoding regime)
  - reduce alphabet size via composition
- New composition method for low-error regime that does not increase # provers
  - Based on "Locally Decode/Reject Codes"

<u>Next</u>: Few words on an alternate approach (giving polynomial instead of near-linear size)

#### Derandomized parallel repetition

- *u-parallel repetition* of Label Cover reduces soundness error from (say) 0.99 to  $\varepsilon = 2^{-O(u)}$ , but blows up size to  $\approx n^{u}$ 
  - Can't get o(1) soundness with polytime reduction (const. u)
- <u>Derandomization</u>: Can we select a *poly-sized subset* of all possible u questions?
  - Limitation [Feige-Kilian]: for u=O(log n) and poly(n) size subsets,  $\epsilon \ge 1/poly(log n)$
- [Dinur-Meir] Match this lower bound, combining
  - Derandomized direct product testing based on subspaces
    [Impagliazzo-Kabanets-Wigderson]
  - Structured "linear" PCPs
    - Identify proof coordinates (vertices) with  $\mathsf{F}^\mathsf{m}$
    - Edges corresponding to 2-query checks form a subspace of F<sup>2m</sup>

#### Composing without an extra prover

- [Dinur-Harsha] alternate composition method to reduce alphabet size keeping #provers at 2
  - Based on "decodable PCPs"
  - Exploit equivalence between robust PCPs and Label Cover
- Applying this to [Dinur-Meir] 2-query PCP, gives:
  Label Cover of *fixed polynomial* (though not near-

linear) size with soundness  $\varepsilon$ ,  $\forall$  constants  $\varepsilon > 0$ 

#### Label Cover $\Leftrightarrow$ Robust PCPs



#### Label Cover $\Rightarrow$ Robust PCPs



#### <u>Verifier</u>

- I. Selects a random "big" vertex  $\mathbf{v} \in \mathbf{V}$
- 2. Reads entire neighborhood of  ${\boldsymbol{v}}$
- 3. Accepts iff there is a value for **v** that would cause all edge constraints to accept.

#### Label Cover $\Rightarrow$ Robust PCPs



NO instances – average view is very "unhappy", i.e. view from a random window is at most  $\delta$  -close to a satisfying view.

#### Label Cover $\Leftarrow$ Robust PCPs



- This transformation is "invertible" (rotate back!)
- $|\Sigma|$  corresponds to the number of accepting configurations, which is  $\leq \exp(\# \text{PCP queries})$ 
  - Reducing PCP queries  $\Rightarrow$  reducing LC alphabet size

#### Low-error 2-prover systems summary

- Some very exciting recent constructions
- <u>Frontier</u>: 2-query PCP of polynomial size and polynomial alphabet with soundness error  $1/(\log n)^{10}$

#### • New proofs and notions

- Robust PCPs and PCPs for proximity
- Short PCPs
- Low-soundness error Label Cover
- Unique Games, Dictatorship tests, etc.
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#### Long code based "inner" PCPs

- <u>Task</u>: Checking that labels a=A(v) and b=A(w) satisfy some Label Cover projection constraint  $\pi(a) = b$
- Check constraints on few (say q) bits of (purported) long codes f, g :  $\{0,1\}^R \rightarrow \{0,1\}$  of labels a and b
  - If f and g are long codes of "consistent" a, b (i.e.,  $\pi(a) = b$ ), accept with prob. 1 (or  $1-\epsilon$ )
  - Acceptance with prob. > s +  $\varepsilon$  implies one can randomly "decode" f, g into labels a', b' s.t.  $\pi(a') = b'$  with prob.  $\theta = \theta(\varepsilon)$

**Recall:** 

 $f=LONG(a) \Rightarrow$ 

- This would imply a soundness s +  $2\epsilon$  q-query PCP

Let's see Håstad's 3-query PCP, and constructing 2-query PCPs.

### Håstad's 3-query PCP

- Pick  $x, y \in \{0, 1\}^R$  u.a.r.
- Pick  $\mu \in \{0,1\}^R$  from the  $\epsilon$ -biased distribution.
- Define  $z \in \{0,1\}^R$  by  $z_j = y_j \oplus x_{\pi(j)} \oplus \mu_j$ .
- With prob. 1/2 check  $g(x) \oplus f(y) \oplus f(z) = 0$ , and with prob. 1/2 check  $g(x) \oplus f(y) \oplus f(\overline{z}) = 1$  $(\overline{z} = \text{coordinate-wise complement of } z).$

Completeness: If  $f(y) = y_a$  and  $g(x) = x_b$  and  $\pi(a) = b$ , then  $g(x) \oplus f(y) \oplus f(z) = x_b \oplus y_a \oplus y_a \oplus x_{\pi(a)} \oplus \mu_a = \mu_a$  Suffices for decoding labels

Soundness: Acceptance prob. >  $\frac{1}{2} + \varepsilon \Rightarrow g$ , f have non-trivial agreement with "consistent" low-weight linear functions
### 3 vs. 2 queries

- Get (1-ε) vs. (½ +ε) hardness for Max3LIN (mod 2)
   Approximation resistant
- Each query point x,y, z is uniformly distributed in  $\{0,1\}^{R}$ 
  - y,z are correlated, but f has to give value to each separately (and each is uniform)
- What about 2-variable linear equations mod 2?
  - [Goemans-Williamson] algo finds assignment of value  $1-O(\sqrt{\epsilon})$  in  $(1-\epsilon)$ -satisfiable instance
  - Matching hardness through a 2-query PCP ?

## A 2-query PCP?

Here's a natural test, saving 1 query in Håstad's test:

- Pick  $x \in \{0,1\}^R$  u.a.r, and  $\epsilon$ -biased noise vector  $\mu \in \{0,1\}^R$
- Set  $y = x \circ \pi \oplus \mu$ , i.e., for  $j \in [R]$ , set  $y_j = x_{\pi(j)} \oplus \mu_j$ .
- With prob. 1/2, check  $g(x) \oplus f(y) = 0$ , with prob. 1/2, check  $g(x) \oplus f(\overline{y}) = 1$ .

<u>Trouble</u>: query y to f is not uniform.  $y_j = y_k$  with prob. close to 1 when  $\pi(j) = \pi(k)$ 

Query y reveals lots of information about projection  $\pi$ Could form "cheating" f by "piecing together" many inconsistent long codes, for portions of  $\{0,1\}^R$  this?

### Unique Games

• Khot's insight: if  $\pi$  is a **bijection**, then  $y = x^{\circ} \pi$  is uniformly distributed (since x is); gives no clue about  $\pi$ 

Unique Game (UG) \* Label Cover where all projection constraints are bijections Khot's Unique Games Conjecture (UGC):  $GapUG_{1-\epsilon,\epsilon}$  is NP-hard for R > R( $\epsilon$ )

- UGC  $\Rightarrow$  analysis of 2-query test reduces to f=g case
  - show that if f passes w.h.p, then f is "like" a long code (modern term: dictator)
  - just codeword testing, no "consistency" checking

## 2-query dictator testing

The core question becomes analyzing "noise stability"  $NS_{\varepsilon}(f) = Prob_{x,\mu} [f(x) = f(x \oplus \mu)]$  (assume f is balanced)

- If f = dictator, then  $NS_{\varepsilon}(f) = 1 \varepsilon$
- If  $NS_{\varepsilon}(f)$  is close to  $1 \varepsilon$ , what can we say?

[Bourgain] If  $NS_{\varepsilon}(f) > 1 - \varepsilon^{0.51}$  then f is close to a junta (depends on few coordinates)

[Mossel-O'Donnell-Oleszkiewicz] (Majority is Stablest Thm) If  $NS_{\varepsilon}(f) > 1 - \Theta(\sqrt{\varepsilon})$  then f has an *influential* coordinate.

Both of these can be used in reduction from Unique Games

### UGC consequences...

- (2- ε) hardness for Vertex cover [Khot-Regev]
- 0.878.. hardness for Max Cut [Khot-Kindler-Mossel-O'Donnell] (using Majority is Stablest)
- Near-tight hardness for all Boolean 2CSPs [Austrin]
- Optimal hardness for every CSP [Raghavendra] (using invariance principle of [Mossel])
- Approximation resistance of every ordering CSP [G.-Håstad-Manokaran-Raghavendra-Charikar]

#### Hardness matching *LP* integrality gaps:

- Multiway Cut, Metric Labeling [Manokaran-Naor-Raghavendra-Schwartz]
- Strict CSPs, covering problems [Kumar-Manokaran-Tulsiani-Vishnoi]

- New proofs and notions
- Robust PCPs and PCPs for proximity
- Short PCPs
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Proving UGC predictions without UGC?

# Bypassing UGC?

- UGC has predicted many strong results
  - All plausible & consistent with our knowledge
  - "combinatorial" ones (like embedding lower bound) confirmed unconditionally
- Yet, **no** UG-completeness result so far
  - Possible that consequences of UGC are true but conjecture itself is false
- <u>Natural question</u>: Can we verify some of UGC's predictions *without* resorting to UGC?
  - Ideally, show NP-hardness
  - Or hardness under weaker assumptions (like optimality of Goemans-Williamson, 2-to-1 conjecture)?

### Smooth Label Cover

• [Khot] Label Cover where for each  $v \in V$ , the projections  $\pi_e$  for edges e incident on v form a "hash family"

 $\forall a \neq a' \operatorname{Prob}_{e \ni v}[\pi_e(a) = \pi_e(a')] \to 0 \quad \text{(for large } R)$ 

- Gap-Smooth-Label-Cover<sub>1,ε</sub> is NP-hard
   Reduction from Label Cover (note perfect completeness)
- Such "locally unique" projections have been useful in some NP-hardness reductions
  - 3-coloring 3-uniform hypergraphs [Khot]
  - Learning intersection of two halfspaces [Khot-Saket]
  - Agnostic learning monomials by halfspaces

[Feldman-G.-Raghavendra-Wu]

### A Gaussian approximation threshold

#### $L_p$ Subspace approximation problem (2 \infty)

Input: A set of m points  $a_1, a_2, \ldots, a_m \in \mathbb{R}^n$ . <u>Goal</u>: Find a (n-1)-dimensional subspace (hyperplane) H minimizing

$$\sum_{i=1}^{m} \operatorname{dist}(H, a_i)^p$$

where dist(H, a) is the min. Euclidean distance between a and any point in H.

**[Deshpande-Tulsiani-Vishnoi]** Factor  $\beta_p$  algorithm where  $\beta_p = \mathbb{E}_{g \sim N(0,1)} [|g|^p]$  is the p'th moment of the standard Gaussian. And matching  $\beta_p - \varepsilon$  Unique-Games-hardness

[G.-Raghavendra-Saket-Wu] NP-hardness of factor  $\beta_p - \epsilon$  approximation, using smooth Label Cover

### Other Label Cover variants

Other structured Label Cover instances discovered in the last decade:

- Multilayered PCPs
- 2-to-1 projections (conjectural)
- Dinur-Safra

## Multilayered PCP

- Multipartite label cover:
  - L layers of vertices  $V_1, V_2, \dots, V_L$
  - Projection maps between every pair of layers:
    - for edge e between  $v_i \in V_i$  and  $v_j \in V_j$  (i < j),  $\pi_e : [R] \rightarrow [R]$  from label of  $v_i$  to label of  $v_j$
- Ensure every  $\gamma$  fraction of vertices have many constraints amongst them (for L > L( $\gamma$  ))
- Introduced in [Dinur-G.-Khot-Regev] to show factor (k-1-ε) hardness for vertex cover on k-uniform hypergraphs
- Later use in hypergraph coloring, non-mixed 3SAT, etc.

### 2-to-1 conjecture

- Label Cover where projection maps are 2-to-1
- <u>Conjecture [Khot]</u>: Gap-2-to-1-LC<sub>1,ε</sub> is NP-hard
   Parallel repetition gives poly(1/ε)-to-1 projections
- Consequences:
  - $-\sqrt{2}-\epsilon$  hardness for vertex cover [Dinur-Safra], [Khot]
  - Hardness of O(1)-coloring 4-colorable graphs [Dinur-Mossel-Regev]
  - Hardness of Gap-No-Two<sub>1,5/8+ $\varepsilon$ </sub> [O'Donnell-Wu]
  - Factor  $1 \frac{1}{k} + O\left(\frac{\ln k}{k^2}\right)$  hardness for Max k-coloring [G.-Sinop]

## [Dinur-Safra]

- This remarkable paper showed factor 1.3606 NP-hardness for vertex cover
- Underlying this was a "2-to-1 like" Label Cover
   label for v consistent with one or two labels for w
  - Soundness: ∀ labeling, every ε fraction of vertices
    has a 100-clique of inconsistent pairs.
- Other applications?

## Wrap-up

- PCPs remarkably successful in showing inapproximability (even beyond initial expectations?)
  - Breadth of problems.
    - I find it amazing what all Label Cover can be reduced to!
  - Many tight results
- Some notorious problems have withstood resolution
  - Densest subgraph, minimum linear arrangement, bipartite clique, sparsest cut, graph bisection, etc.
  - Known algorithms have superconstant approx. ratio, but even APX-hardness not known

### Cut challenges

Eg. Uniform Sparsest Cut, Minimum Bisection:

Best approximation (log n) $\Omega(1)$ . Hardness evidence:

- I. Refuting random 3SAT is hard  $\Rightarrow$  Factor 1.1 hardness [Feige]
- 2. Polytime (1+ $\varepsilon$ ) approximation  $\Rightarrow$  NP has  $2^{n^{\epsilon'}}$  time algorithms [Khot, "quasi-random PCPs"]
- 3. Superconstant hardness under "SSE hypothesis" (stronger than Unique Games conjecture) [Raghavendra-Steurer-Tulsiani]

#### "Easiness" evidence [G.-Sinop]

Factor (1+ε)/λ<sub>r</sub> approximation in 2<sup>O<sub>ε</sub>(r)</sup>n<sup>O(1)</sup> time where λ<sub>r</sub> is the r'th smallest eigenvalue of normalized Laplacian.
 Factor 3/λ<sub>r</sub> for minimum uncut

## Challenges

- Can PCP machinery (even assuming UGC) give strong hardness results for Steiner Tree, TSP, Asymmetric TSP ?
- Lasserre integrality gaps beyond known hardness bound for Vertex Cover, Max Cut (or Unique Games)?

– Just 4 rounds could improve [GW] and refute UGC !

- Unique-Games-completeness?
- Bypass UGC for some other consequences?
- Other hardness assumptions: eg. Densest subgraph?
   Or finding indep. Sets of size εn when one of size n/100 exists
- Unchartered terrain for inapproximability:
  - eg., nearest codeword in algebraic codes, bin packing, ...