# Approximation Algorithms For Projection Games

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"It's good to look at algorithms once in a while as a sanity check on your lower bounds."

Michael Sipser

# Projection Games ("Label Cover")





An edge  $e=(a,b)\in E$  is satisfied by assignments  $f_A: A \rightarrow \Sigma_A$ ,  $f_B: B \rightarrow \Sigma_B$ , if  $\pi_e(f_A(a))=f_B(b)$ .

**Label Cover:** Given  $G=(G=(A,B,E), \Sigma_A, \Sigma_B, \{\pi_e\}_e),$ Find  $f_A: A \rightarrow \Sigma_A, f_B: B \rightarrow \Sigma_B$  maximizing fraction of satisfied edges.

Instance (nearly) *satisfiable* if (almost) all edges can be satisfied.



# Example II: Unique & p-to-1 Games

- We say that a projection game is
  "p to 1" if
  p=Max<sub>e∈E, σ∈ΣB</sub> |π<sub>e</sub><sup>-1</sup>(σ)|.
- Unique games are 1 to 1 games.



# This Work

**Combinatorial algorithms for satisfiable and nearly satisfiable projection games:** 

- 1. Poly-time  $\Omega((1 / |E| |\Sigma_A|)^{1/4})$ -approximation for satisfiable projection games.
- 2. Sub-exponential time exact algorithm for *smooth* satisfiable projection games.
- 3. PTAS for satisfiable and nearly-satisfiable projection games *on planar graphs*.



Strong PCP Theorem [Raz94, M-Raz08]

There is c>0, such that for any  $\varepsilon = \varepsilon(n) \ge 1/n^c$ , there is  $k=k(\varepsilon)$ , such that given a projection game of size n and alphabet size k such that all its edges can be satisfied simultaneously, it is NP-hard to find an assignment that satisfies more than  $\varepsilon$  fraction of the edges.

Most optimal NP-hardness of approximation results are based on this theorem...

# Hardness of Approximation From Projection Games

- [...,Bellare,Goldreich,Sudan 95, Håstad 97]: *MAX-3SAT* is NP-hard to approximate to within  $\frac{7}{8} + \epsilon'$ .
- $\epsilon$ ' is determined by  $\epsilon$  of the product tion



#### What is the best tradeoff between n, k and E?

- [Raz 94] (parallel repetition): NP-hard even for k≤poly(1/ε) for const ε>0.
- [M, Raz 08]:  $k \le \exp(\operatorname{poly}(1/\epsilon))$  for any  $\epsilon \ge 1/n^c$ .
- [Dinur, Steurer 13] (parallel repetition of [M, Raz 08]):
  k≤exp(1/ε) for any ε≥1/n<sup>c</sup>.
- "Projection Games Conjecture": k ≤ poly(1/ε) for any ε≥1/ n<sup>c</sup>.
- Folklore: can satisfy  $\epsilon \geq 1/n, 1/k$  fraction of the edges.
- [Peleg 02]:  $\epsilon \ge 1/(nk)^{1/2}$ .
- [Charikar, Hajiaghayi, Karloff 09]:  $\varepsilon \ge 1/(nk)^{1/3}$ .
- [Manurangsi, M 13]:  $\varepsilon \ge 1/(nk)^{1/4}$ .

# Poly-Time, Poly-Approximation:

• *Simplifying assumption:* graph bi-regular; p-to-1 (possibly for a large p).

# **Overall Approach: Win-Win**

- Algorithm 1: Satisfies  $1/D_B$  fraction, where  $D_B$ =degree of B vertices.
- Algorithm 2: Satisfies  $p / |\Sigma_A|$  fraction, where p=number of pre-images of a label in  $\Sigma_B$ .
- Algorithm 3: Satisfies hD<sub>A</sub> / | E | p fraction, where h=largest number of neighbors of neighbors of an A vertex.
- Algorithm 4: Satisfies  $\Omega(D_B / D_A h)$  fraction.

Approximation factor = max of above four  $\geq$  (multiplication of above four)<sup>1/4</sup> =  $\Omega((1 / |E| |\Sigma_A|)^{1/4})$ .

# **1**/**D**<sub>B</sub> Approximation

- Pick an arbitrary assignment to the A vertices.
- Per B vertex decide about one neighbor and satisfy the edge between them.



# $p / |\Sigma_A|$ Approximation

• Pick an assignment at random.

2.

• Can derandomize by a greedy algorithm.



# 3. hD<sub>A</sub>/p|E| Approximation

- Let N(a)=a's neighbors; N<sub>2</sub>(a)=a's neighbors' neighbors;
- Go over all possible assignments to a:
  - Get labels for the D<sub>A</sub> vertices in N(a).
  - Get p labels for the h vertices in  $N_2(a)$ .
- There must be an assignment that satisfies hD<sub>A</sub>/p edges that touch N<sub>2</sub>(a), and we can find it greedily.



# $\Omega$ (D<sub>B</sub>/D<sub>A</sub>h) Approximation

- Take  $a \in A$  such that  $|N_2(a)| \le h$ .
- Find an assignment that satisfies all  $D_A D_B$  edges on  $N(a) \cup N_2(a)$ .
- Claim: Can continue ≈ | A | /hD<sub>A</sub> times, each time satisfying ≈ D<sub>A</sub>D<sub>B</sub> new edges.



### **PTAS for Planar Graphs**

#### **General approach:**

- 1. Delete a few edges to ensure constant tree-width.
- 2. Solve using dynamic programming.

### Tree Decomposition & Tree-Width

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- Subsets B<sub>1</sub>,...,B<sub>n</sub> of vertices and tree on them.
- Every edge is inside some B<sub>i</sub>.
- If a vertex is in B<sub>i</sub> and B<sub>j</sub>, then it's in all B<sub>l</sub>'s on their tree path.

Tree-width =  $\max |B_i| - 1$ 

Theorem (Klein): For any planar graph and number k, can find in linear time at most 1/k fraction of edges to remove, so tree width O(k).

# Algorithm For Constant Tree-Width Graphs

- Scan tree on B<sub>i</sub>'s from leaves up.
- Per assignment inside B<sub>i</sub> register how many edges in its sub-tree satisfies.



# Saw Two Algorithms:

- Poly time  $\Omega((1 / |E| |\Sigma_A|)^{1/4})$ -approximation for satisfiable projection games.
  - What's the right dependence?  $(1 / |E| |\Sigma_A|)^{o(1)}$  would contradict the Projection Games Conjecture.
- PTAS for projection and unique games on planar graphs.
  - More easy projection/unique games?

