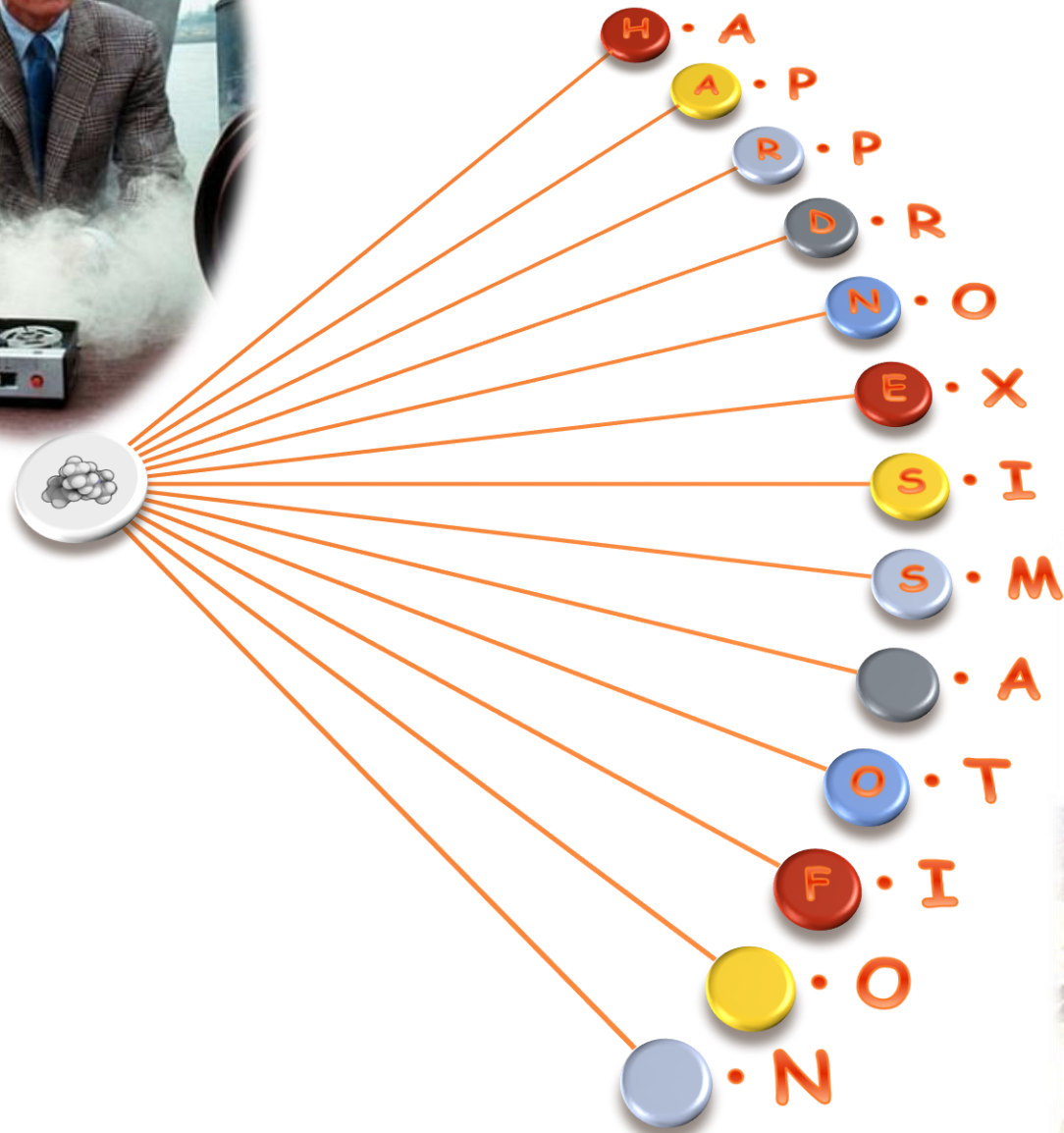




Goal:

- Show some approximation problems NP-hard

Plan:

- How to show inapproximability?
- Probabilistically Checkable Proofs (PCP)
- CLIQUE, COLORING

Promise Problems - Illustrated

Σ Is there an assignment satisfying 90% of a 3SAT, assuming one can satisfy 80%?

Good inputs

- Must accept

Bad inputs

- Must reject

Other inputs

- Whatever

Gap problems? A special case

Optimization

problem

CLIQUE

3SAT

S.C.

min/max



instance

graph

3CNF

family

solution

clique

assign.

cover

parameter

|clique|

#clause

|cover|

Objective

- Best solution according to optimization parameter

Approximation

- Find a solution within some factor of optimal

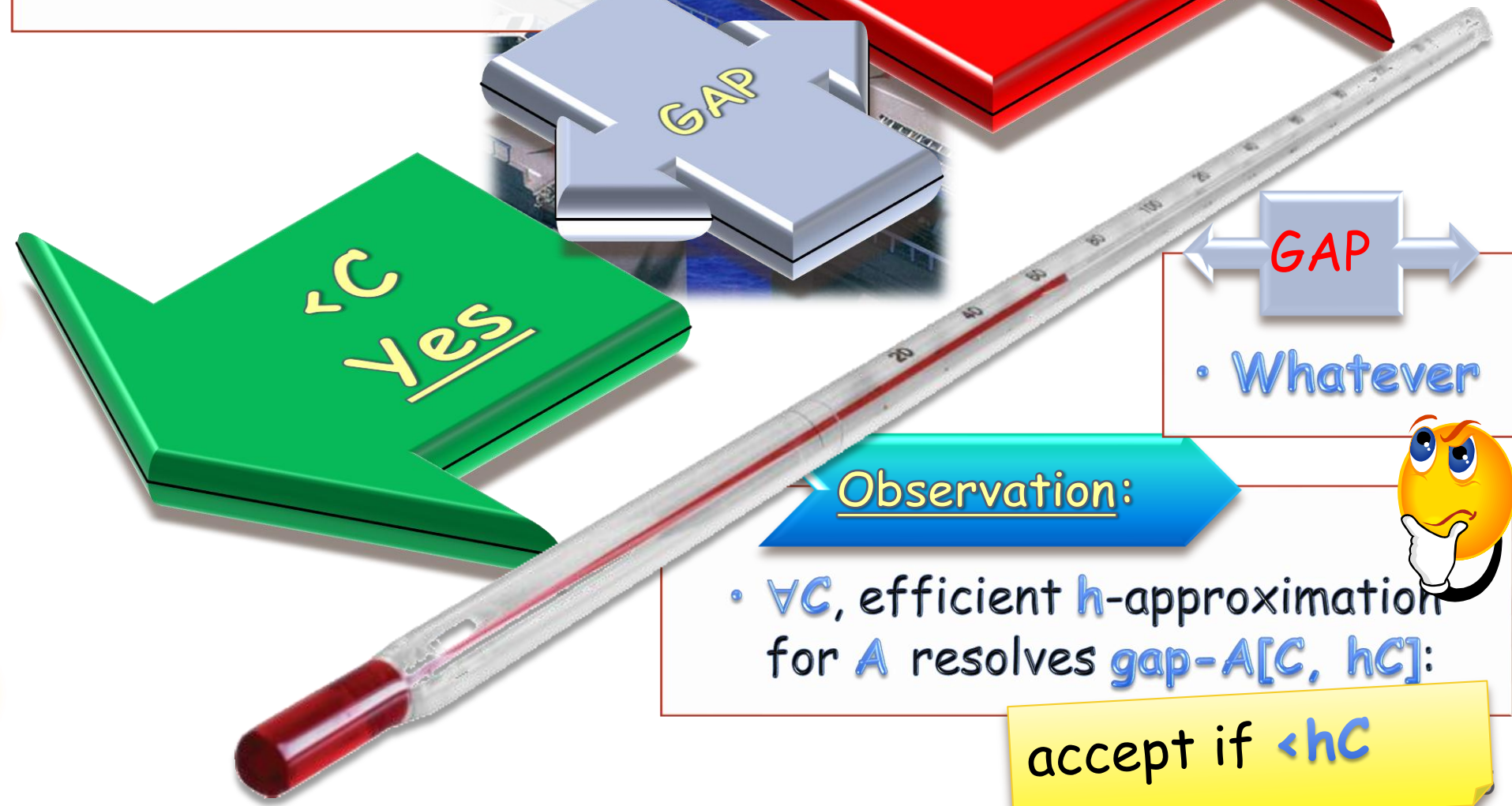
algorithm

optimal

Gap- $A[C, hC]$ (minimization)

In optimal Solution

- Parameter is



Gap-3SAT

Instance:

- 3-CNF

Gap Problem:
 $[7/8 + \epsilon, 1]$

- Maximum, over assignments, of
fraction of satisfiable clauses:

Yes

• = 1

No

• < $7/8 + \epsilon$

Why $7/8$?

EG

- $(x_1 \vee x_2 \vee x_3)$
- $(x_1 \vee \neg x_2 \vee \neg x_2)$
- $(\neg x_1 \vee x_2 \vee x_3)$
- $(\neg x_1 \vee \neg x_2 \vee \neg x_2)$
- $(\neg x_1 \vee x_2 \vee \neg x_3)$
- $(\neg x_3 \vee \neg x_3 \vee \neg x_3)$

$x_1 \rightarrow F ; x_2 \rightarrow T ; x_3 \rightarrow F$
satisfies 5/6 of clauses

Claim:

- $\forall \text{ 3CNF}$ (clauses: exactly 3 independent literals)
 $\exists \text{ assignment}$ that satisfies $\geq 7/8$ of clauses

Proof:

E How many does an assignment satisfy *expectedly*?

Y_i $\forall \text{ clause } C_i$, let Y_i be a 0/1 variable: "is C_i satisfied?"

$E Y_i$ Y_i 's expectation: $E[Y_i] = 7/8$

E $E[\sum Y_i] = \sum E[Y_i] = m7/8$ ($m = \# \text{clauses}$)

$\exists$ $\exists \text{ assignment}$ with at least that number satisfied

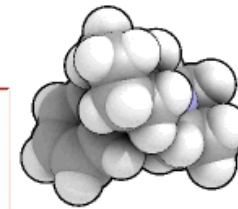




PCP Characterization of NP

Theorem (PCP):

- $\forall \epsilon > 0$, $\text{Gap-3SAT}[7/8 + \epsilon, 1]$ is NP-hard



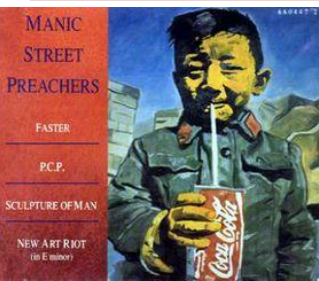
Proof:



$\forall L \in \text{NP}$, Karp reduction f to 3CNF:
 $x \in L \Rightarrow f(x) \in 3\text{SAT}$
 $x \notin L \Rightarrow \text{max satisfy} < 7/8 + \epsilon \text{ of } f(x)$

- Cuius rei demonstrationem mirabilem sane detexi. Hanc marginis exiguitas non caperet ☺

Approximating max-3SAT to within which factor is thus proven NP-hard?



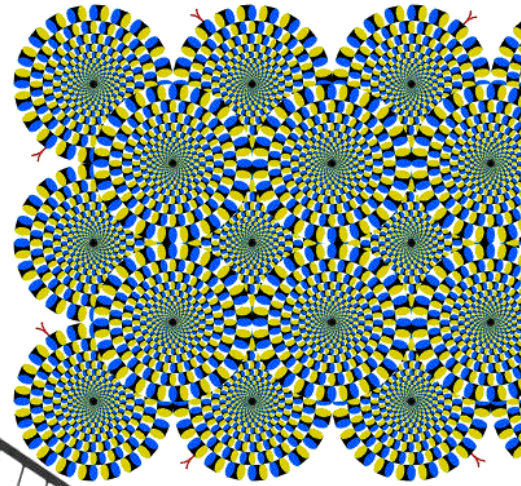
Probabilistic Checking of Proofs



Verify witness

- Choose only $O(1)$ bits to read (randomly)

for gap-3SAT: pick $O(1)$ clauses



Gap-CLIQUE

Instance:

- $G=(V,E)$
(of m IS's each of size 3)

Gap Problem:

$[(7/8+\epsilon)/3, 1/3]$

- Parameter: fractional size of
largest CLIQUE:

Yes

- $\geq 1/3$

No

- $< (7/8+\epsilon)/3$

Theorem:

- Gap-CLIQUE
 $[(7/8+\epsilon)/3, 1/3]$ is
NP-hard

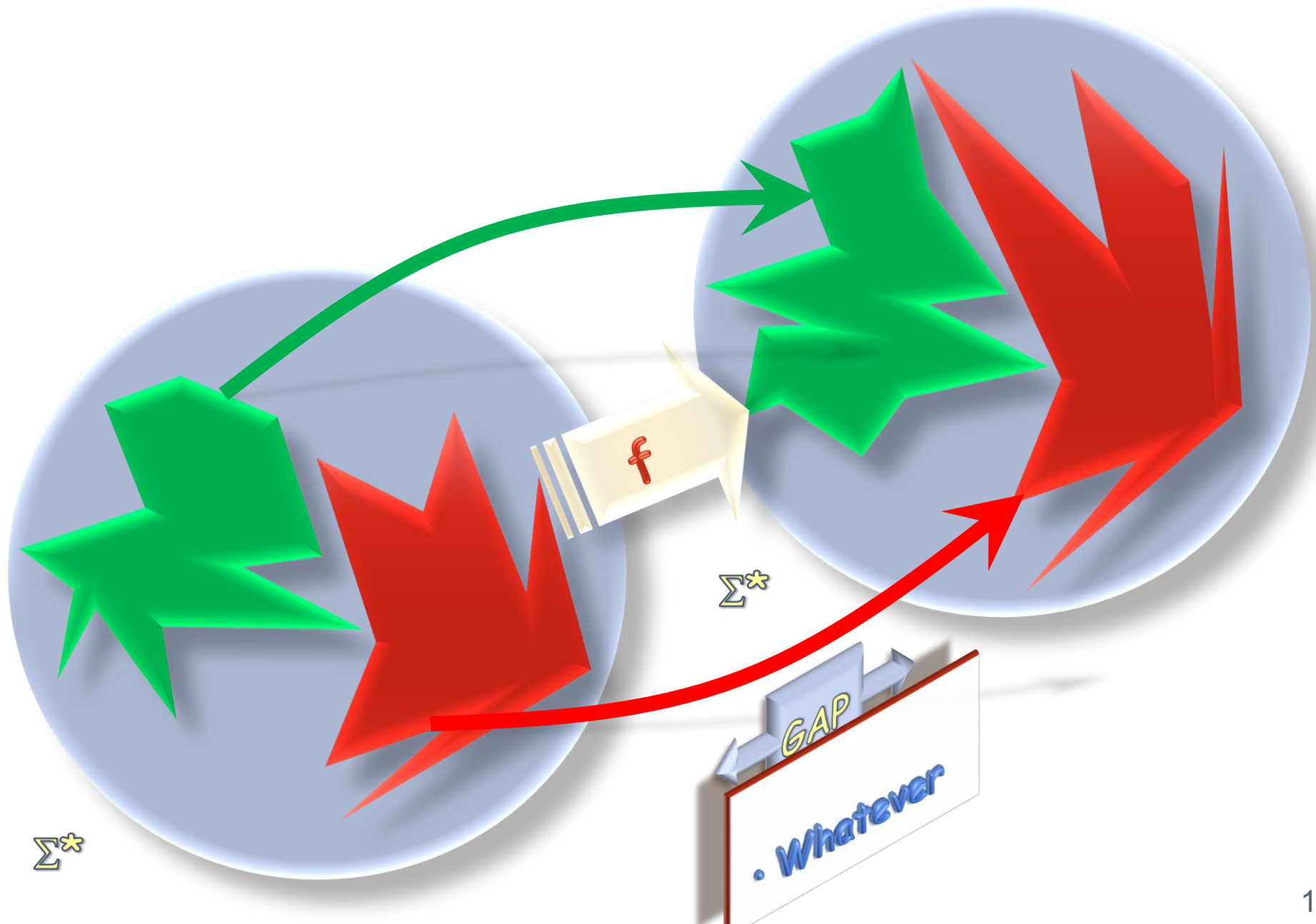
Corollary:

- It is NP-hard to
approximate MAX-
CLIQUE to within $7/8+\epsilon$

How does one prove such an
NP-hardness theorem?

Reduce from gap-3SAT?

Gap Preserving Reduction



1 vertex for 1 occurrence

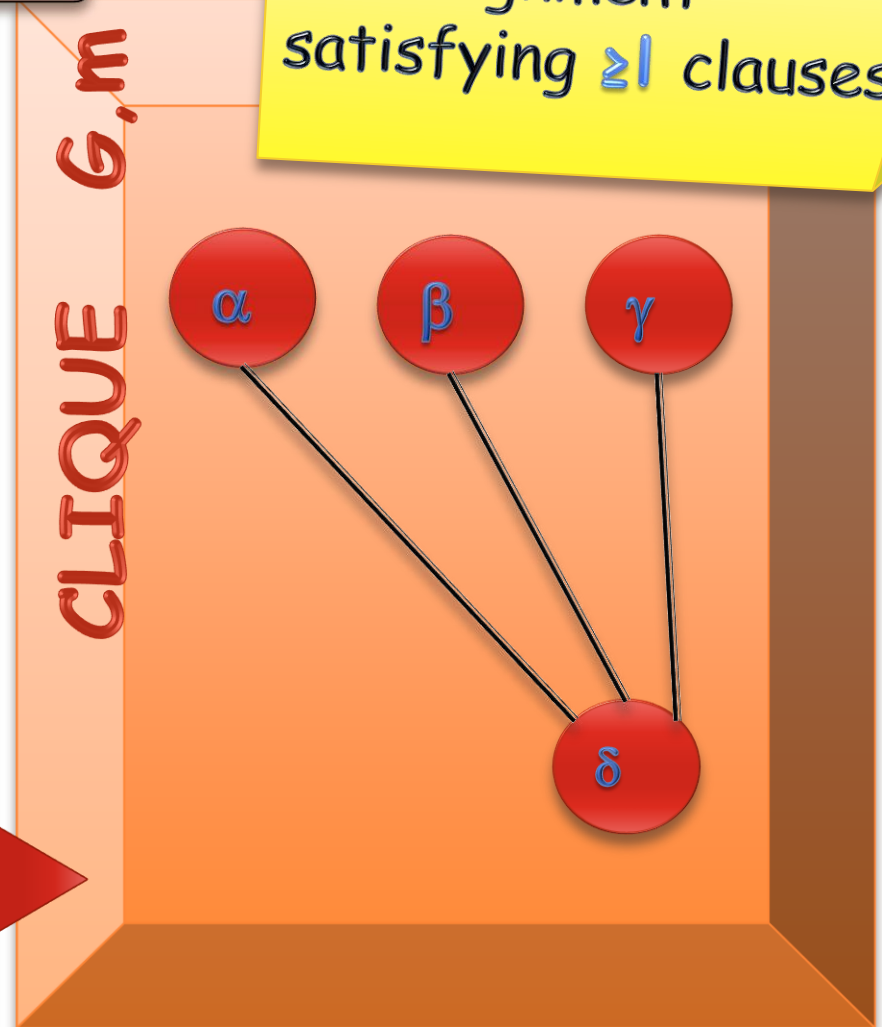
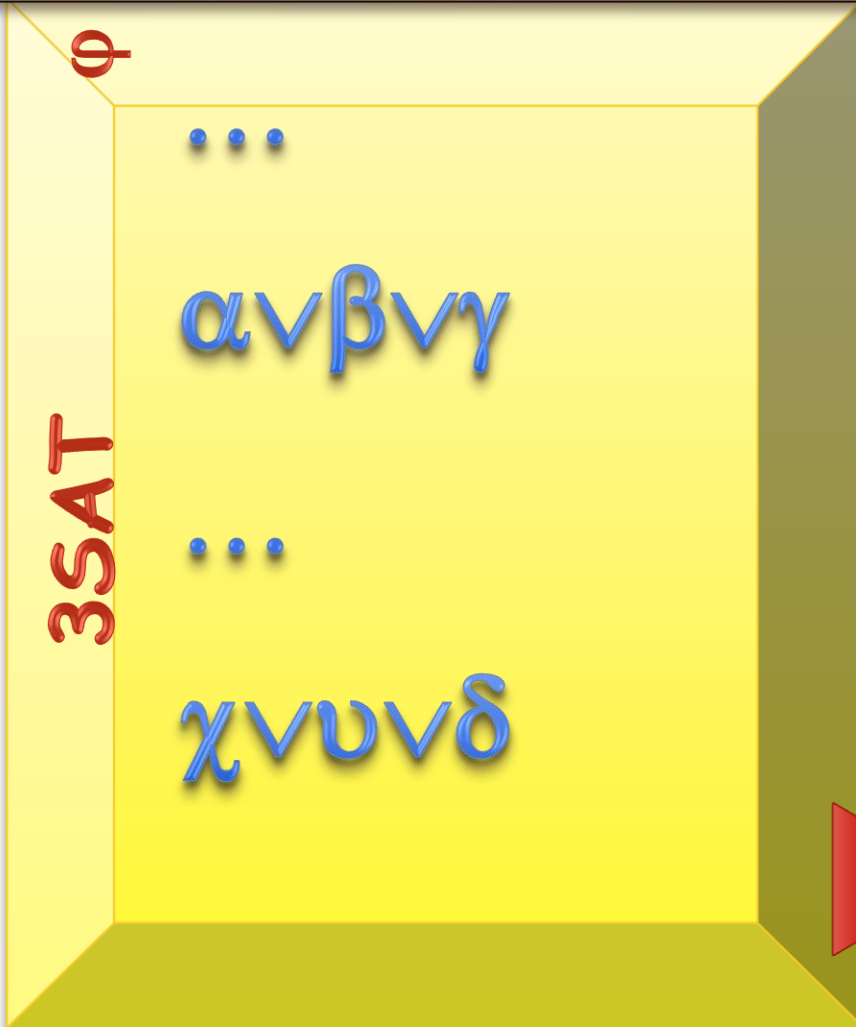
inconsistency $\Leftrightarrow$ non-edge

• within triplets. $\alpha = \neg \delta$.

m = number of clauses

$$\underline{SAT} \leq_p \underline{CLIQUE}$$

A clique of size $l \Rightarrow$
an assignment
satisfying $\geq l$ clauses



Color Coordination

Party

- A set of partygoers; each pair of friends agree on possible pairs of colors

Solution: MAX_V

- Invite some partygoers
--- set colors s.t.
all pairs OK



Optimize:

- How many invited

Solution: MAX_E

- Assign a color to every partygoer



Optimize:

- Number of OK pairs

Constraints' Graph

CSG Input:

$$\cdot U = (V, E, \Sigma, \phi) \quad - \quad \phi: E \rightarrow \mathcal{P}[\Sigma^2]$$

Solution: MAX_V

$$\begin{aligned} \cdot A: V &\rightarrow \Sigma \cup \{\perp\} \text{ s.t.} \\ \forall (u,v) \in E: & A(u), A(v) \in \Sigma \\ \Rightarrow & (A(u), A(v)) \in \phi(u,v) \end{aligned}$$



EG CLIQUE
IS
3SAT
V.C.
 $\chi(G)$

Optimize:

$$\cdot \Pr[A(u) \in \Sigma]$$

Solution: MAX_E

$$\cdot A: V \rightarrow \Sigma$$



Optimize:

$$\cdot \Pr[(A(u), A(v)) \in \phi(u,v)]$$

EG MAX-CUT
 $\chi(G)$

Instance:

- $U=(V,E, [k], \phi)$

Gap Problem: $[\alpha, \beta]$

- Fractional size of largest all-consistent assignment:

Yes

- $\geq \beta$

No

- $\leq \alpha$

How does one prove $kCSG$ is NP-hard?

Reduce from gap-3SAT?

gap_V-kCSG $[\alpha, \beta]$

Observe:

- Gap_V-3CSG $[(7/8+\epsilon), 1]$ is NP-hard

3SAT is a 'special case'

Theorem:

- $\forall \delta > 0 \exists k=k(\delta)$
gap-IS $[\delta/k, 1/k]$
NP-hard

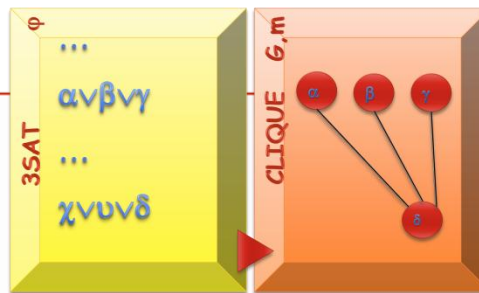
Proof: via $kCSG$

Claim $[CSG \rightarrow IS]$:

$$\text{gap}_V - k \text{CSG}[\delta, 1] \leq_L \text{gap-IS}[\delta/k, 1/k]$$

Proof:

- $V' = V \times \Sigma$,
- $i \neq j \Rightarrow ((u, i), (u, j)) \in E'$
- $(i, j) \notin \phi(u, v) \Rightarrow ((u, i), (v, j)) \in E'$



$\text{Gap}_V - 3\text{CSG}[(7/8 + \varepsilon), 1]$ is NP-hard

$$\text{gap}_V - k \text{CSG}[\delta, 1] \leq_L \text{gap}_V - k' \text{CSG}[\delta', 1]$$

$$\text{gap}_V - k \text{CSG}[\delta, 1] \leq_L \text{gap-IS}[\delta/k, 1/k]$$

Yes

• $I = (u, A(u))$ 1 in each clique

No

• $A(u) = i \mid (u, i) \in I$ $\forall u$ there is ≤ 1 such i

Party on



Whatever constraints,
I can always invite 1%
of partygoers

In that case, I can do
99%, whatever the
constraints are!



How?

'Invent' a guest for
every set of 1 real
guests



Theorem:

$$\text{gap}_V\text{-}k\text{CSG}[\delta, 1] \leq_L \text{gap}_V\text{-}k'\text{CSG}[\delta', 1]$$

Proof:

- $V' = V, \Sigma' = \Sigma$
- E' : (u', v') s.t. $\exists u \in u', v \in v'$ s.t.
 $u = v$ or $(u, v) \in E$
- ϕ' forbids: $A(u')_{\downarrow u} \neq A(v')_{\downarrow u}$ or
 $(A(u')_{\downarrow u}, A(v')_{\downarrow v}) \notin \phi(u, v)$

Yes

- Natural, consistent assignment

No

- Color $u \in u'$ by $A(u')_{\downarrow u}$ if any such $u' \in V'$ is colored. $u' \in V'$ is colored only if all $u \in u'$ are colored

Gap_V-
3CSG[(7/8+ε), 1]
is NP-hard

$$\text{gap}_V\text{-}k\text{CSG}[\delta, 1] \leq_L \text{gap}_V\text{-}k'\text{CSG}[\delta', 1]$$

$$\text{gap}_V\text{-}k\text{CSG}[\delta, 1] \leq_L \text{gap-}IS[\delta/k, 1/k]$$

Settle differences

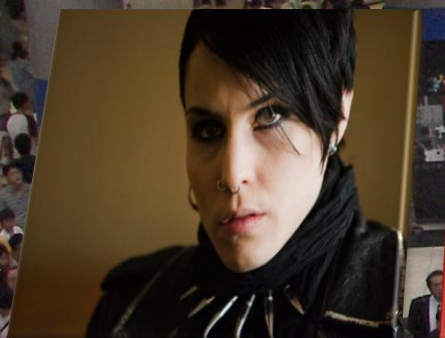


Constraints depend only
on difference $\Rightarrow$ I can
invite δ of partygoers

In that case, I can do
the same for general
constraints



And what does it get
you?



Show approximate
coloring of a graph is
NP-hard



If colors are (mod q)

$\forall$ constraint $\phi(u, v)$
depends only on
 $A(u) - A(v) \pmod{q}$

$\Rightarrow$ Many symmetric
colorings



$q\text{CSG}_\Delta$ Instance:

- $U = (V, E, \Sigma, \phi)$
 $\phi: E \rightarrow P[\Sigma^2]$ is define by
 $\Delta: E \rightarrow P\{[q]\}$ thus
 $\phi(u, v) = \{(i, j) \mid i - j \bmod q \in \Delta(u, v)\}$

$P\{[q]\}$ = all
subsets of
 $\{0..q-1\}$

Theorem:

- $\text{gap}_V\text{-}k\text{CSG}[\delta, 1] \leq_L \text{gap}_V\text{-}q\text{CSG}_\Delta[\delta, 1]$
 $q = (nk)^5$

q-Coloring

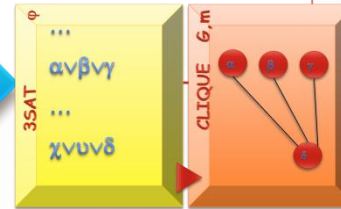
Corollary:

- $\text{gap-}\chi[q, q/\delta]$ is NP-hard

$q\text{CSG}_\Delta$ Instance:

- $U = (V, E, \Sigma, \phi)$
 $\phi: E \rightarrow P[\Sigma^2]$ is define by
 $\Delta: E \rightarrow P[\{q\}]$ thus
 $\phi(u, v) = \{(i, j) \mid i - j \bmod q \in \Delta(u, v)\}$

Proof:



Theorem:

- $\text{gap}_V\text{-}k\text{CSG}[\delta, 1] \leq_L \text{gap}_V\text{-}q\text{CSG}_\Delta[\delta, 1]$
 $q = (nk)^\delta$

- Apply same $\text{CSG} \rightarrow \text{IS}$ reduction

Yes

- Consistent $A \Rightarrow$
 $\forall d \ A^d(v) = A(v) + d \pmod{q}$ consistent

q disjoint IS covering all

No

- vertexes partitioned into IS's of fractional size $\leq \delta/q$ - how many?

Triplets' Unique T

Lemma:

- For $q = |X|^5$, can efficiently construct $T: X \rightarrow [q]$ s.t.

$$\begin{aligned} &\forall x_1, x_2, x_3, x_4, x_5, x_6, \\ &T(x_1) + T(x_2) + T(x_3) \equiv \\ &T(x_4) + T(x_5) + T(x_6) \pmod{q} \\ &\Rightarrow \{x_1, x_2, x_3\} = \{x_4, x_5, x_6\} \end{aligned}$$

Proof:

- Incrementally assign values to members of U

Corollary:

- T is unique for pairs and for single vertexes as well

Proof:

- $T(x) + T(u) \equiv T(v) + T(w) \pmod{q} \Rightarrow \{x, u\} = \{v, w\}$
- $T(x) \equiv T(y) \pmod{q} \Rightarrow x = y$

Proof:

$q\text{CSG}_\Delta$

$q\text{CSG}_\Delta$ Instance:

- $U = (V, E, \Sigma, \phi)$
 $\phi: E \rightarrow P[\Sigma^2]$ is define by
 $\Delta: E \rightarrow P[\{q\}]$ thus
 $\phi(u, v) = \{(i, j) \mid i - j \bmod q \in \Delta(u, v)\}$

Theorem:

- $\text{gap}_V\text{-kCSG}[\delta, 1] \leq_L \text{gap}_V\text{-}q\text{CSG}_\Delta[\delta, 1]$
 $q = (nk)^5$

Yes

- for good A : $A'(u) = T(u, A(u))$ **good**

No

- for good A' : $\exists! d$ $A(u) = T^{-1}(u, A'(u) - d)$ **good**

Assume a complete graph
- add trivial constraints

Pairs: assuming A' colors vertexes u, v

denote: $d_{A'}(u, v) =$ that unique d

- $\exists! d$ s.t. $A'(u) = T(u, i) + d$ & $A'(v) = T(v, j) + d$ for $(i, j) \in \phi(u, v)$

Triplets: assuming A' colors vertexes u, v, w

- $d_{A'}(u, v) = d_{A'}(v, w)$ as $A'(u) - A'(v) + A'(v) - A'(w) + A'(w) - A'(u) \equiv 0 \pmod{q}$

General: assuming A' any partial coloring

- If $d_{A'}$ is not everywhere the same, $\exists$ inconsistent triplet (u, v, w)

Gap-UG $[\epsilon, 1-\epsilon]$

Constraints

- Colors' permutations

In optimal Solution

- $\Pr[(A(u), A(v)) \in \phi(u, v)]$



- Whatever



Question:

- Is it in P or NP-hard?



Gap-MC[$1-\sqrt{\epsilon}$, $1-\epsilon$]

Optimal cut

- $\Pr[A(u) \neq A(v)]$



- Whatever

Note:

- gap-Max-Cut[$1-1.01\epsilon$, $1-\epsilon$]
NP-hard

PCP

PCP Theorem

Clique

SAT

3SAT

Vertex Cover

Coloring

CNF

NP-Hard

Interactive
Proof System