

Promise

Constraint

Satisfaction

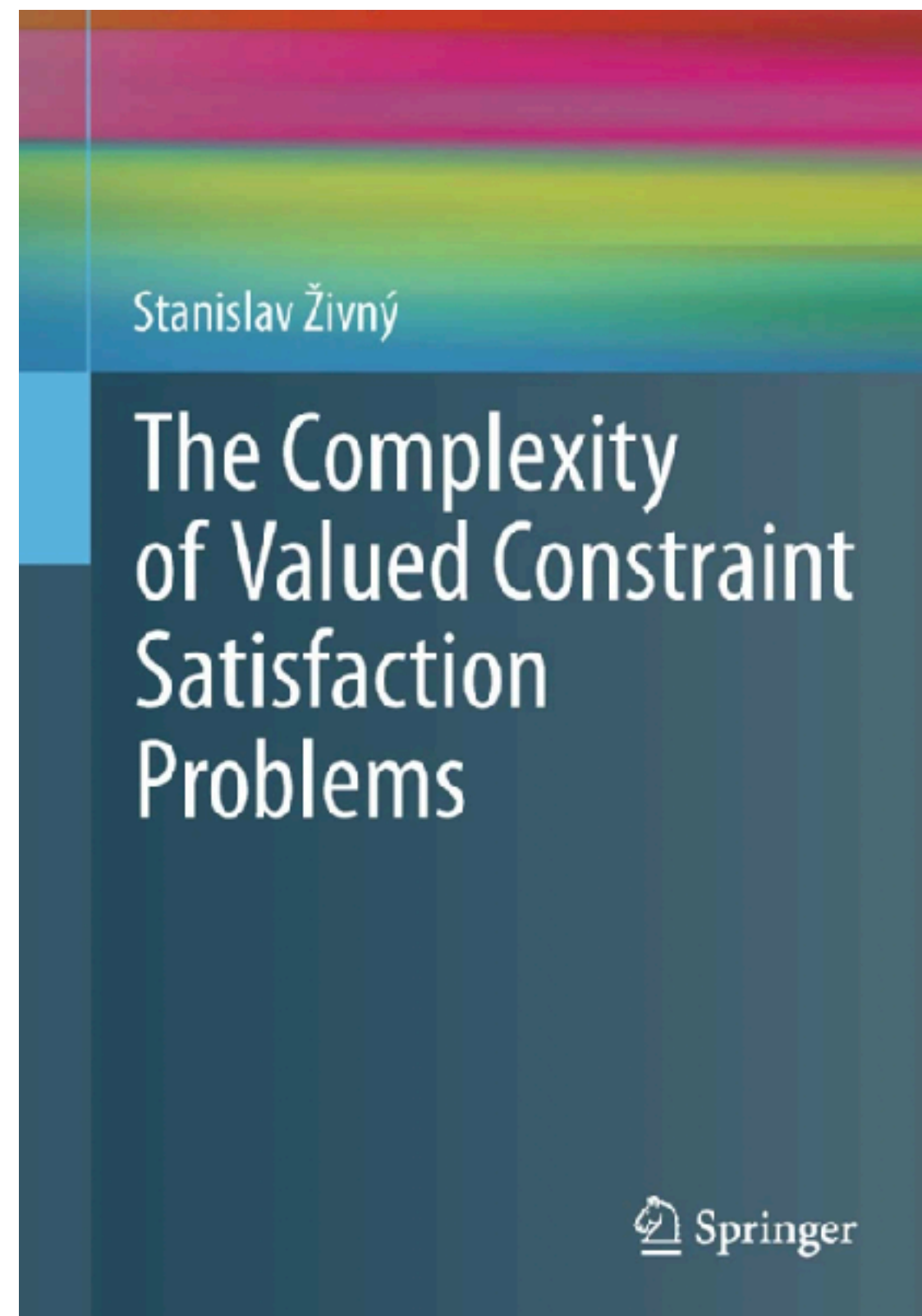
Problems

standa Živný (Oxford)

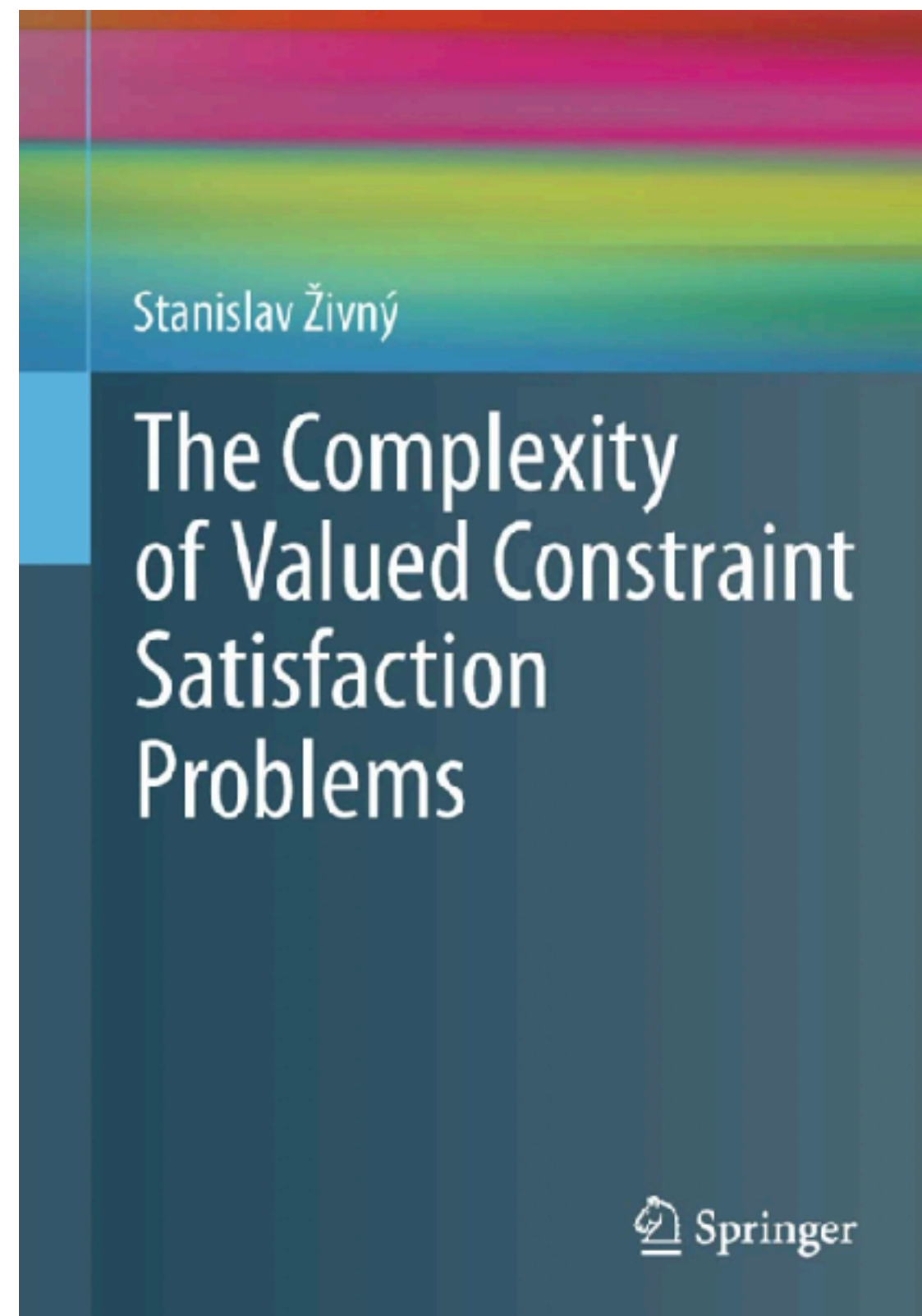
Liblice, 27th September 2023

January 2009

January 2009



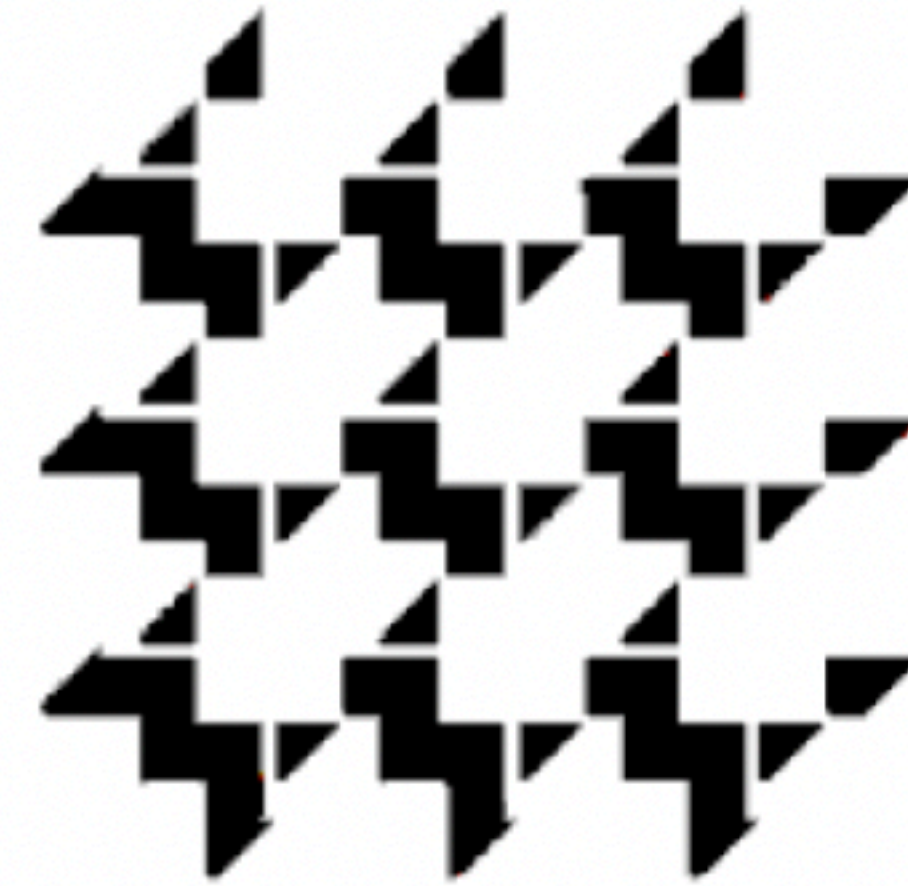
January 2009



January 2009

DIMACS

*Center for Discrete Mathematics & Theoretical Computer Science
Founded as a National Science Foundation Science and
Technology Center*



DIMACS-RUTCOR Workshop on Boolean and Pseudo-Boolean Functions in Memory of Peter L. Hammer

January 19 - 22, 2009

University Inn and Conference Center

New Brunswick Campus, Rutgers University

Organizers:

Endre Boros, Director of RUTCOR, [Endre.Boros at rutcor.rutgers.edu](mailto:Endre.Boros@rutcor.rutgers.edu)

January 2009



ELSEVIER

Discrete Applied Mathematics 123 (2002) 155–225

DISCRETE
APPLIED
MATHEMATICS

Pseudo-Boolean optimization [☆]

Endre Boros*, Peter L. Hammer

RUTCOR, Rutgers University, 640 Bartholomew Road, Piscataway, NJ 08854-8003, USA

January 2009



ELSEVIER

Discrete Applied Mathematics 123 (2002) 155–22

Pseudo-Boolean optimization

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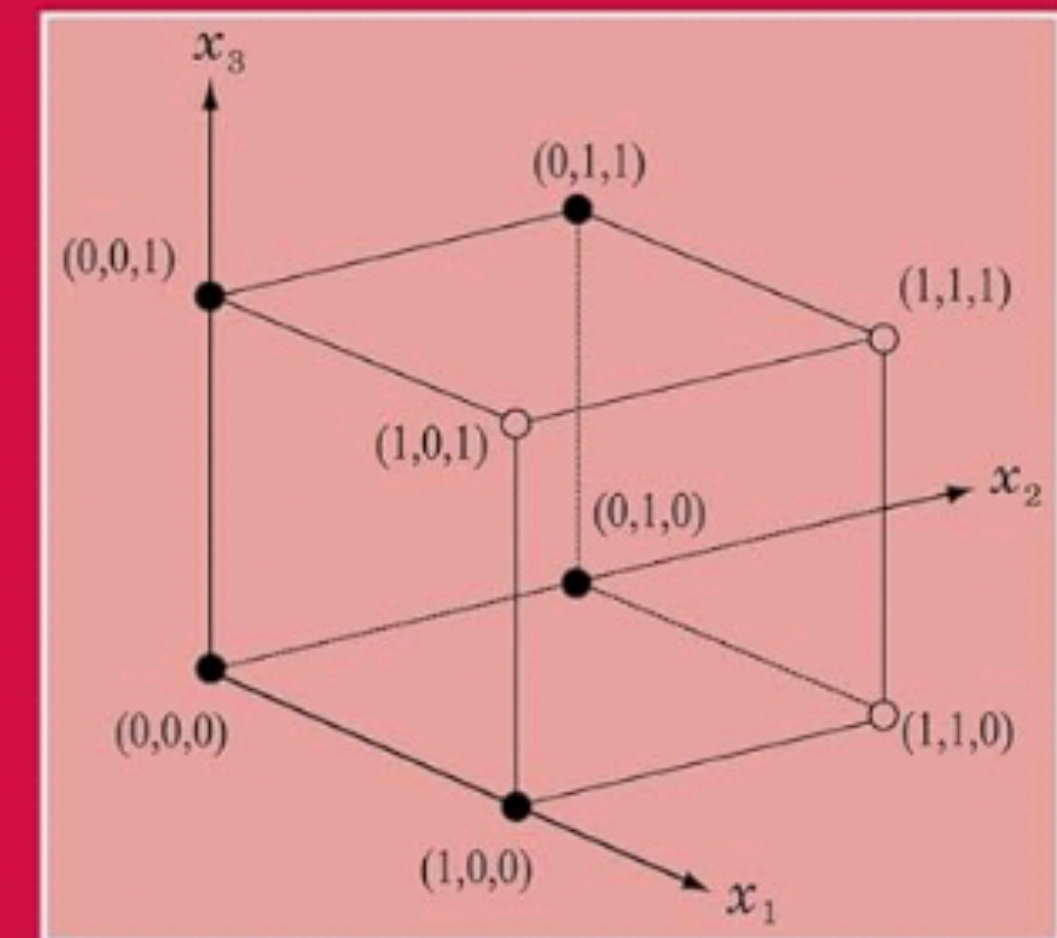
RUTCOR, Rutgers University, 640 Bartholomew Road, Piscataway

Encyclopedia of Mathematics and Its Applications 142

BOOLEAN FUNCTIONS

Theory, Algorithms, and Applications

Yves Crama and Peter L. Hammer



CAMBRIDGE

I. Examples

7-SAT

$$(x_1 \vee \bar{x}_2 \vee x_3 \vee \bar{x}_4 \vee \bar{x}_5 \vee x_6 \vee x_7)$$

7-SAT

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Thm: (l, g, k) -SAT in P if $\frac{g}{k} \geq \frac{1}{2}$ and NP-hard otherwise. [Austrin-Guruswami-Håstad SICOMP'17]

7-SAT

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NP-hardness of $(l, g, 2g+1)$ -SAT.

$$(a,g,k) \equiv_p (a+1,g+1,k+1)$$

7-SAT

$$(x_1 \vee \bar{x}_2 \vee x_3 \vee \bar{x}_4 \vee \bar{x}_5 \vee x_6 \vee x_7)$$

Thm: (l,g,k) -SAT in P if $\frac{g}{k} \geq \frac{1}{2}$ and NP-hard otherwise. [Austrin-Guruswami-Håstad SICOMP'17]

NP-hardness of $(l,g,2g+1)$ -SAT.

1-in-3-SAT

$$(x_1 \vee x_2 \vee x_3) \wedge (x_2 \vee x_4 \vee x_5)$$

NAE-3-SAT

$$(x_1 \vee x_2 \vee x_3) \wedge (x_2 \vee x_4 \vee x_5)$$

1-in-3/NAE-3-SAT

$$(x_1 \vee x_2 \vee x_3) \wedge (x_2 \vee x_4 \vee x_5)$$

1-in-3/NAE-3-SAT

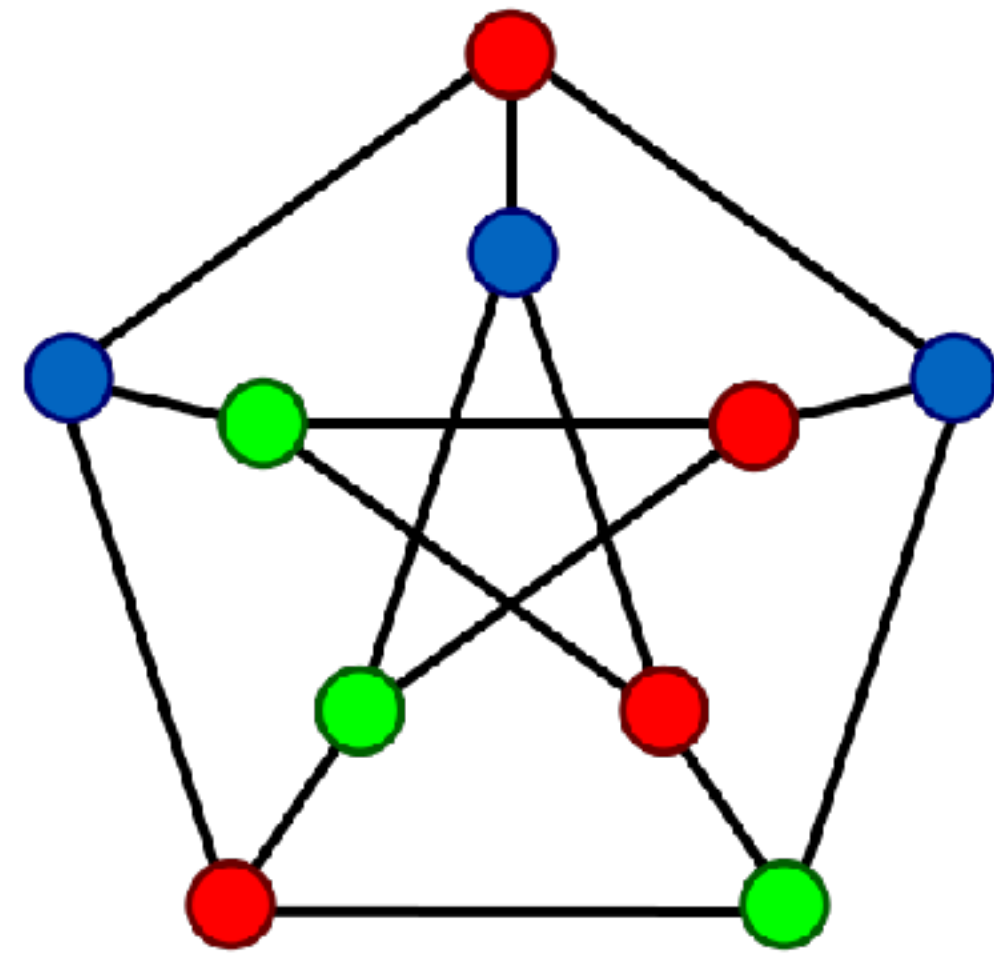
$$(x_1 \vee x_2 \vee x_3) \wedge (x_2 \vee x_4 \vee x_5)$$

1-in-3/NAE-3-SAT

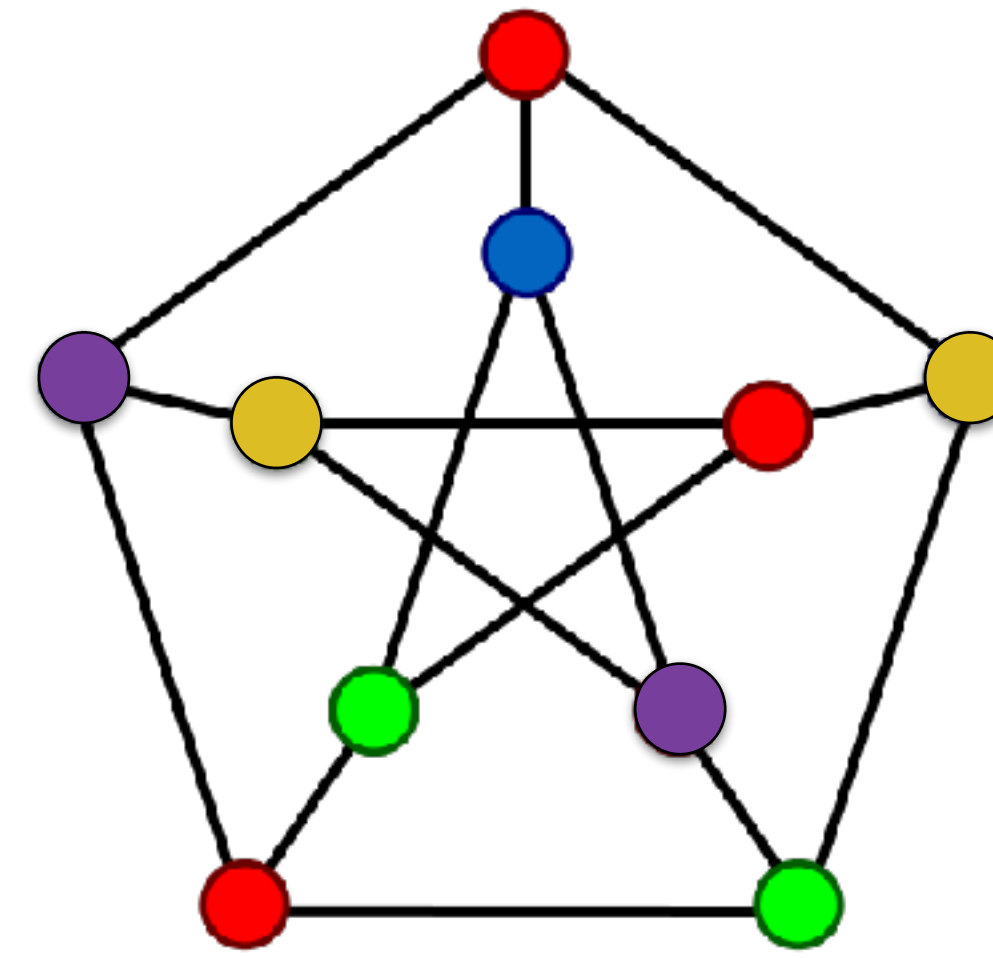
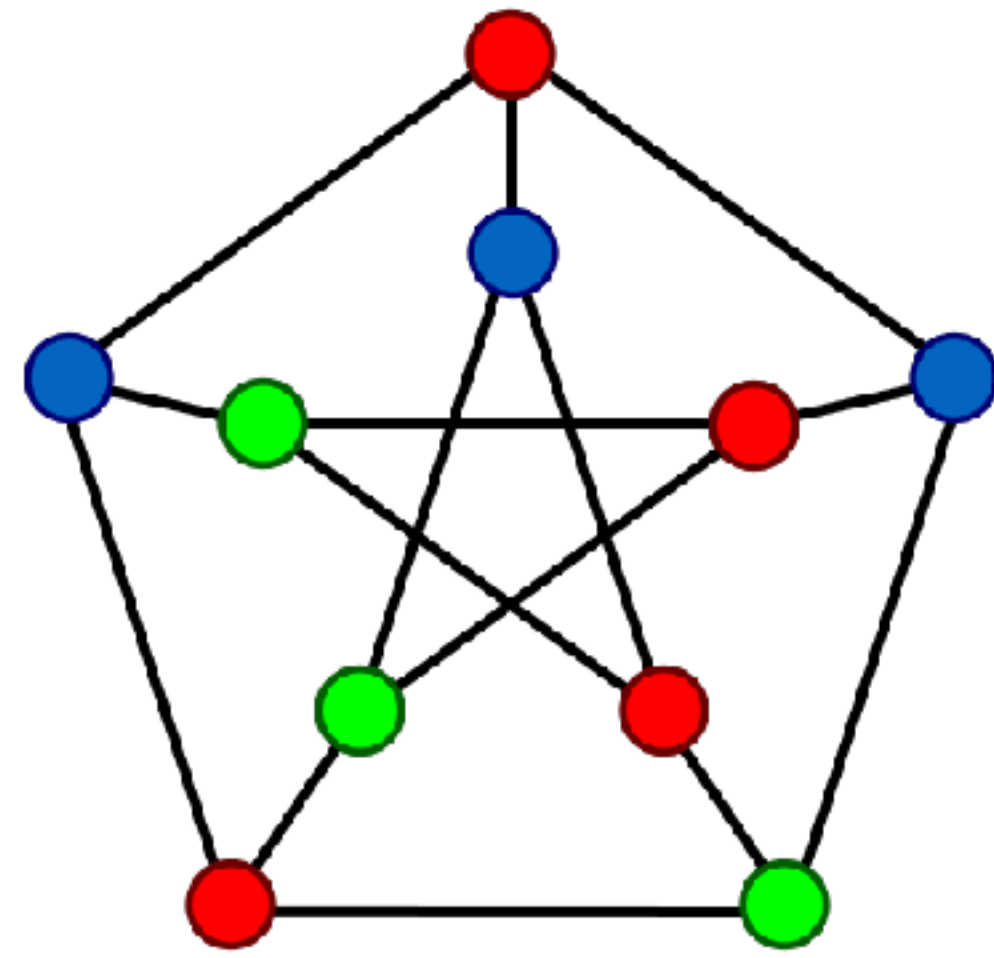
$$(x_1 \vee x_2 \vee x_3) \wedge (x_2 \vee x_4 \vee x_5)$$

Thm: 1-in-3/NAE-SAT is in P. [Brakensiek-Guruswami SICOMP'21]

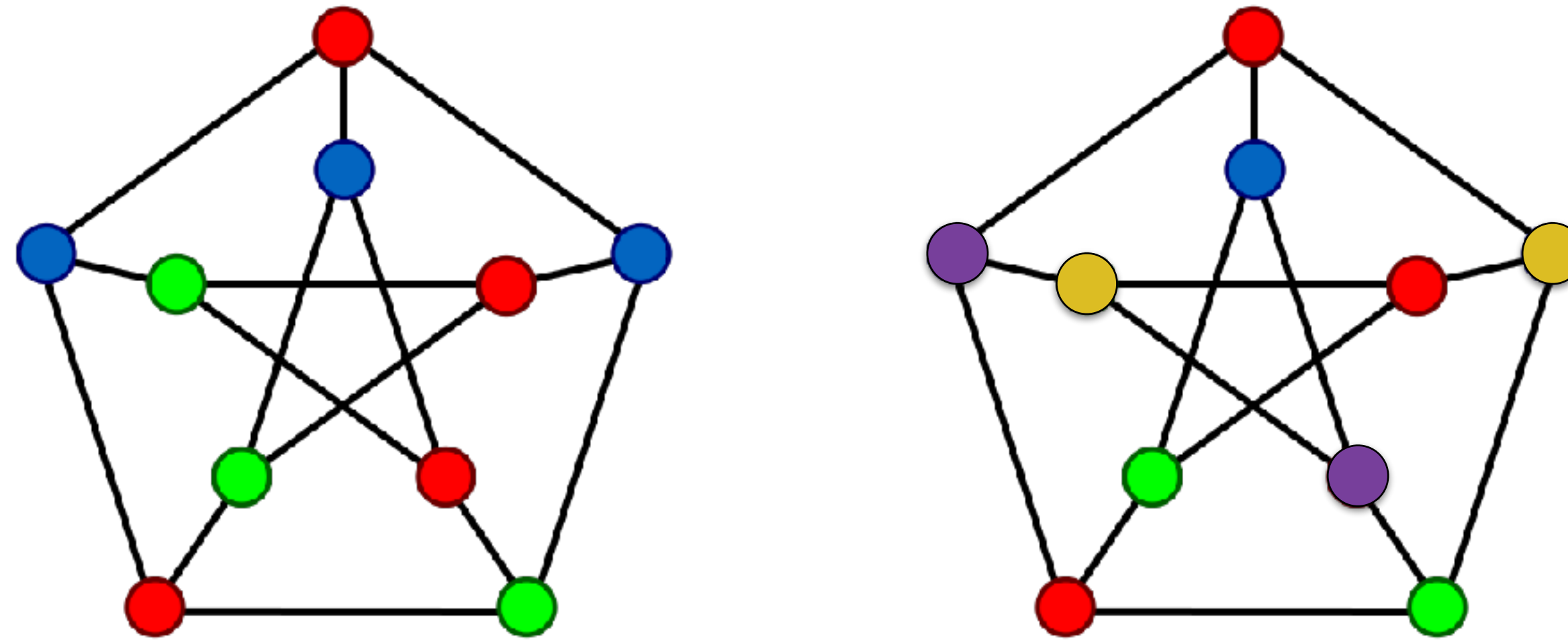
Graph Colouring



Graph Colouring

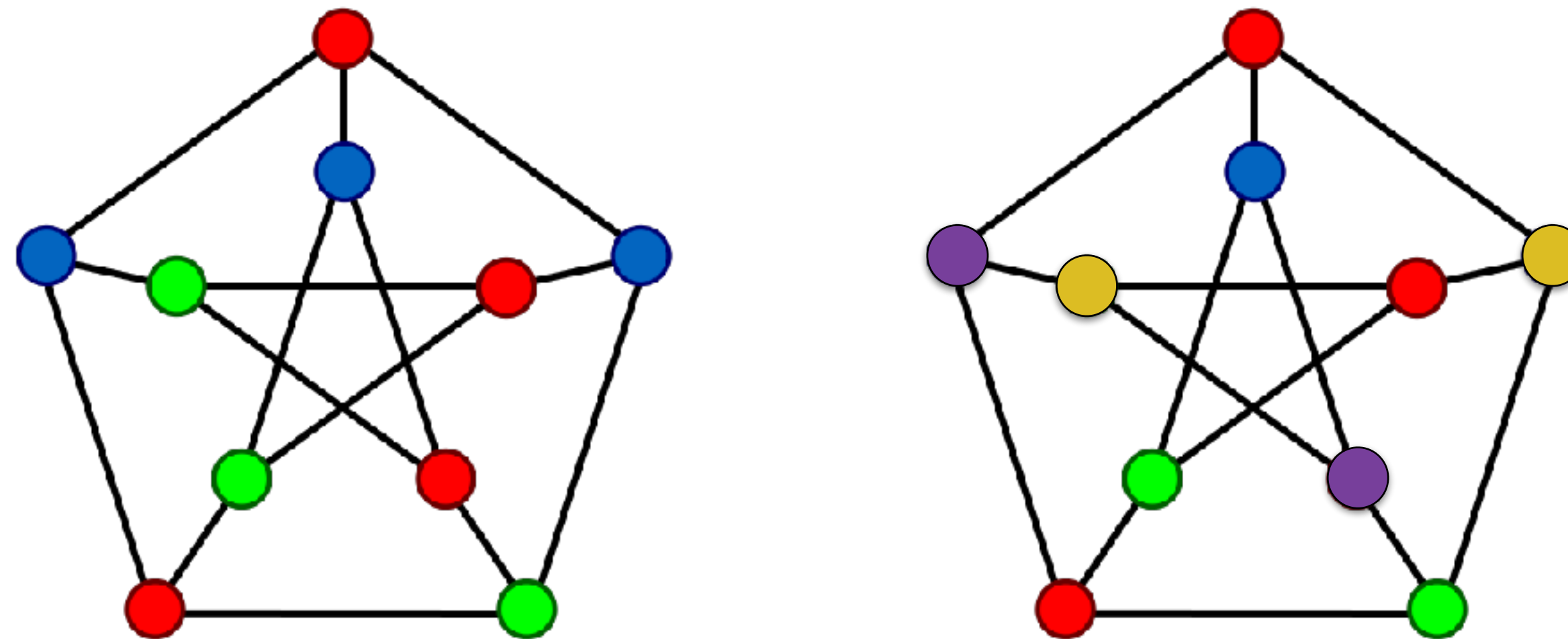


Graph Colouring



Find a c -colouring of a k -colourable graph.

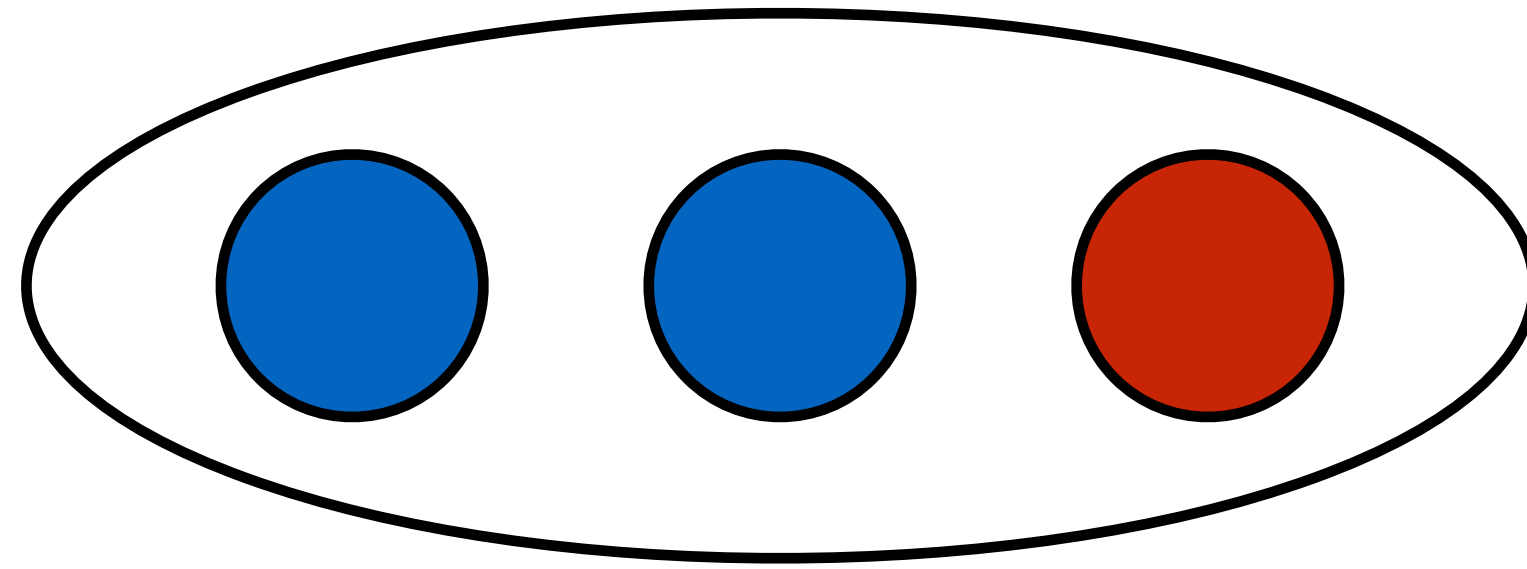
Graph Colouring



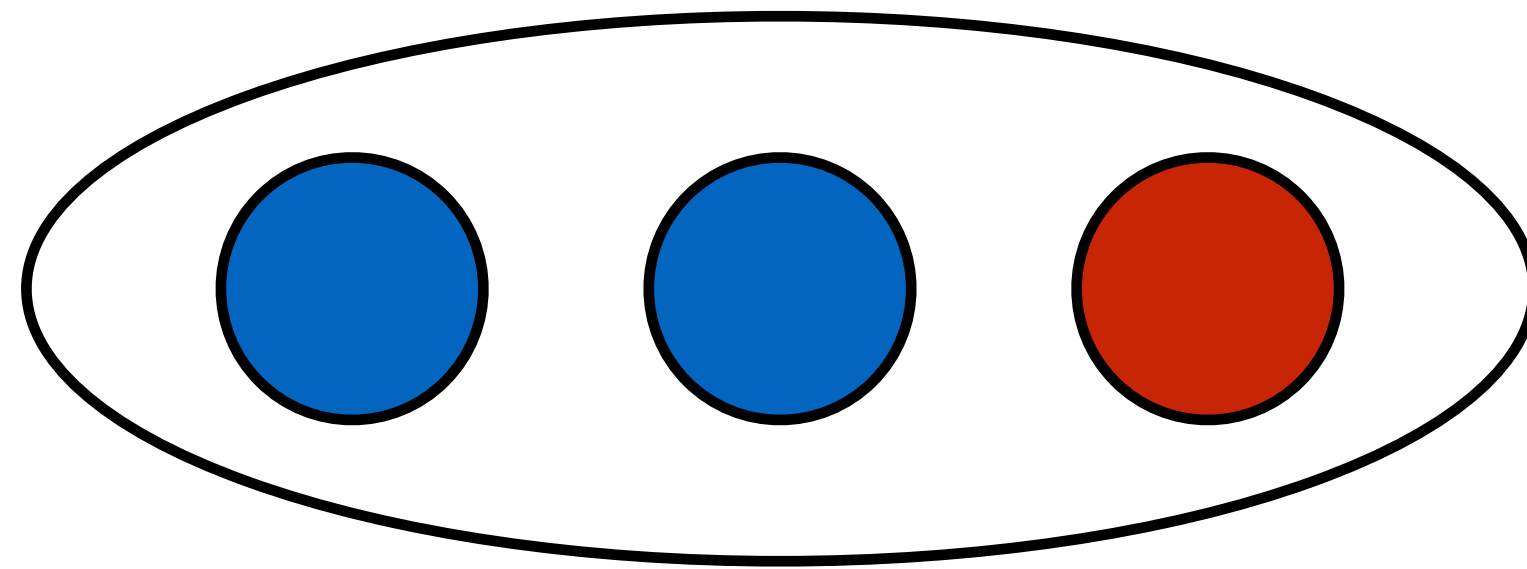
Find a c -colouring of a k -colourable graph.

Conjecture: NP-hard for every constant $c \geq k \geq 3$. [Garey-Johnson JACM'76]

Hypergraph Colouring

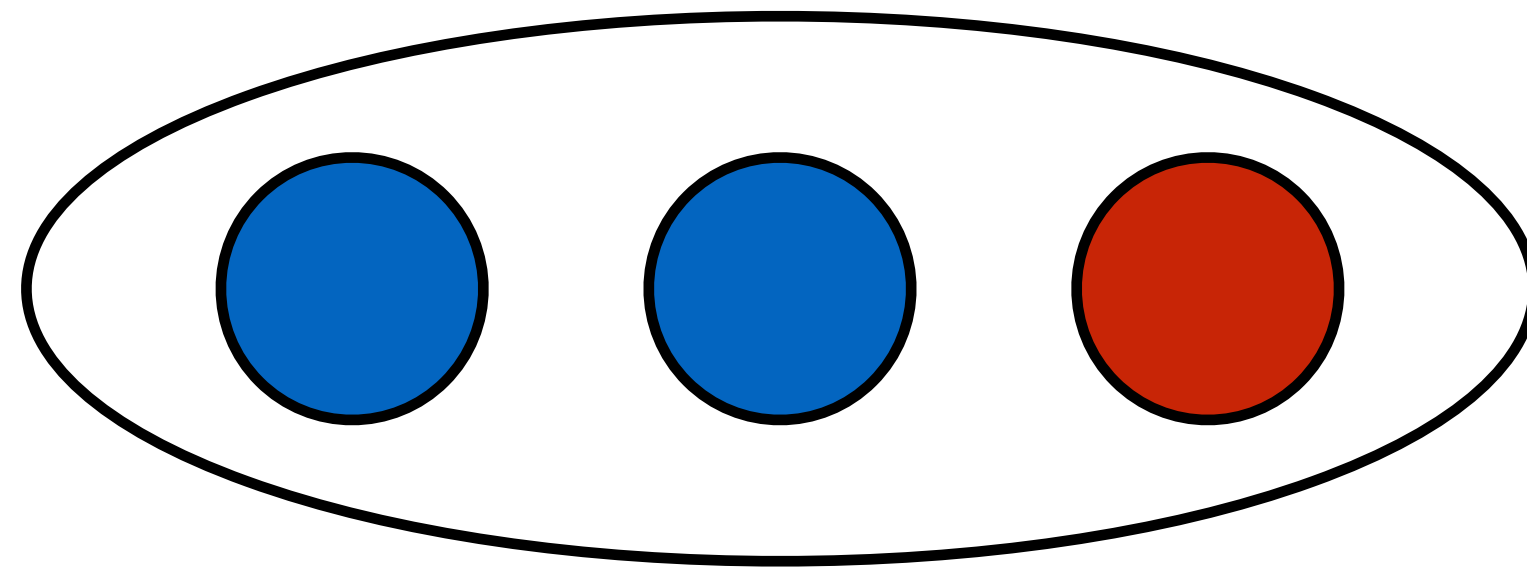


Hypergraph Colouring



Find a c -colouring of a k -colourable 3-uniform hypergraph.

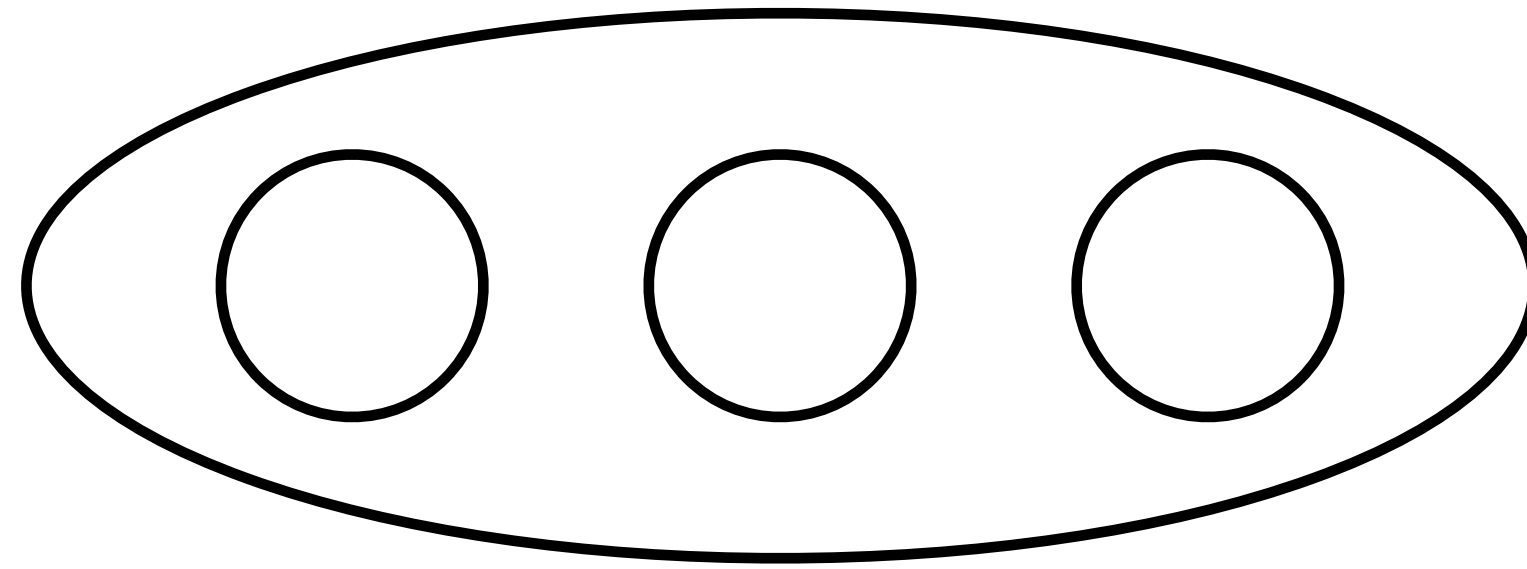
Hypergraph Colouring



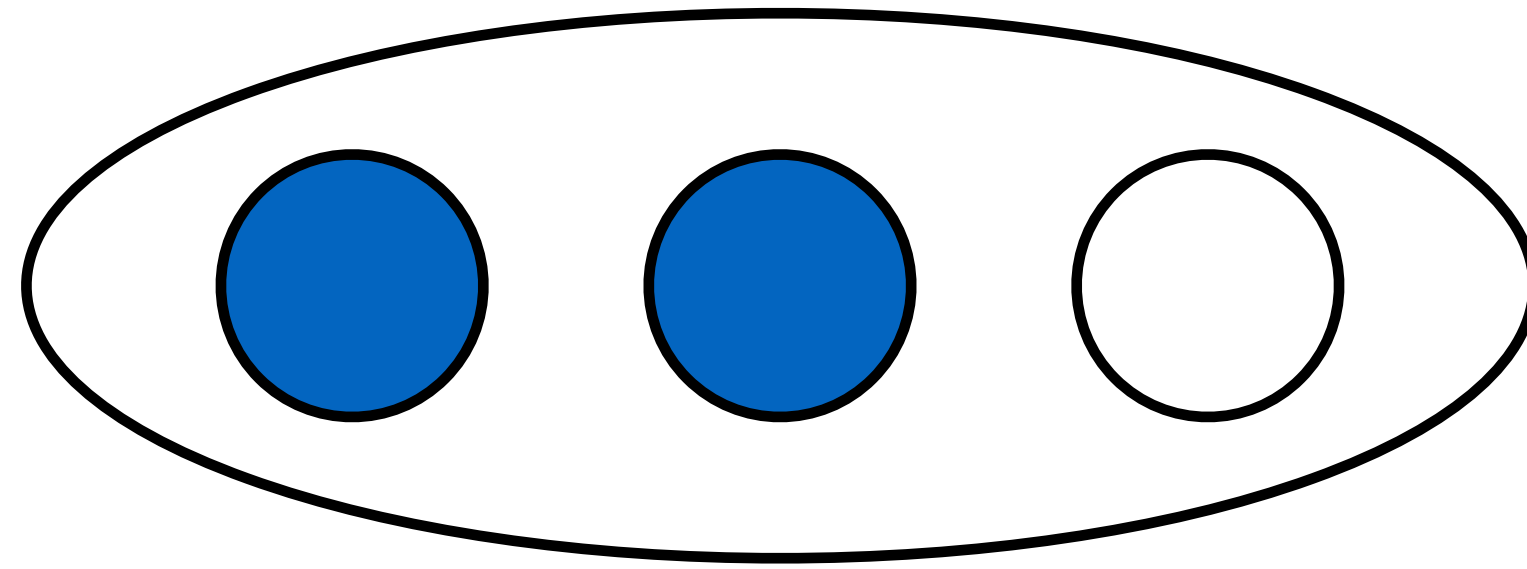
Find a c -colouring of a k -colourable 3-uniform hypergraph.

Thm: NP-hard for every constant $c \geq k \geq 2$. [Dinur-Regev-Smyth *Combinatorica*'05]

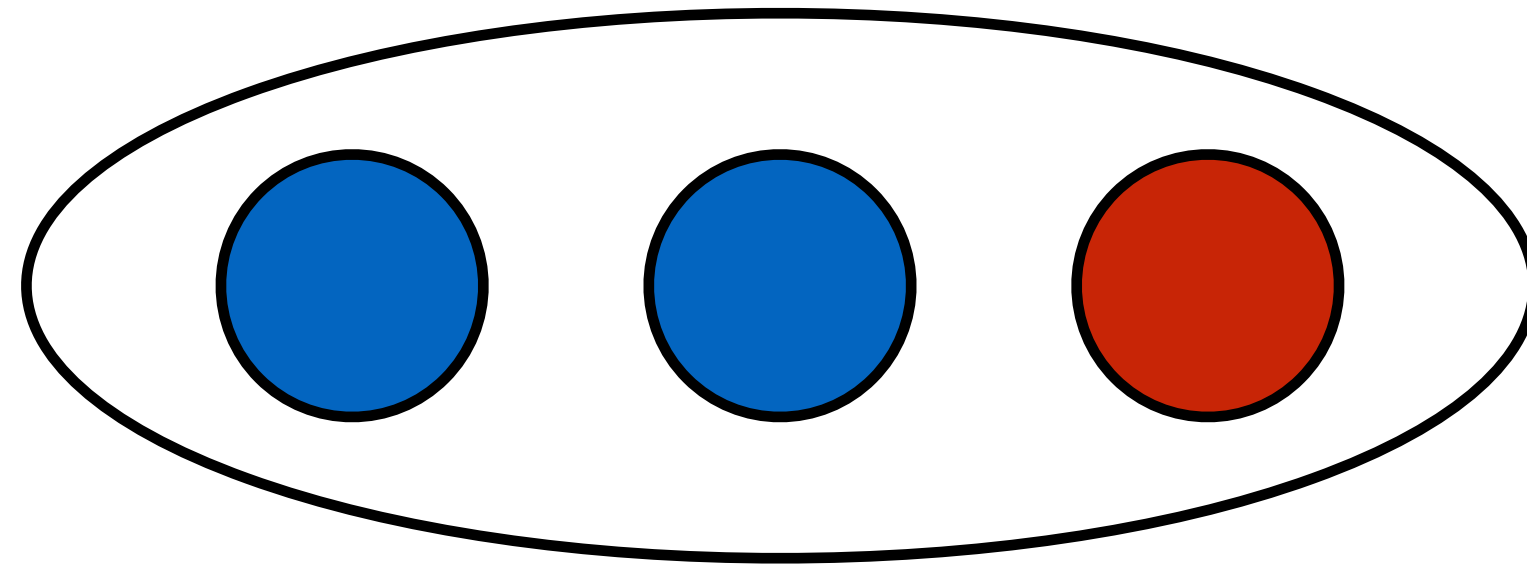
LO Colouring



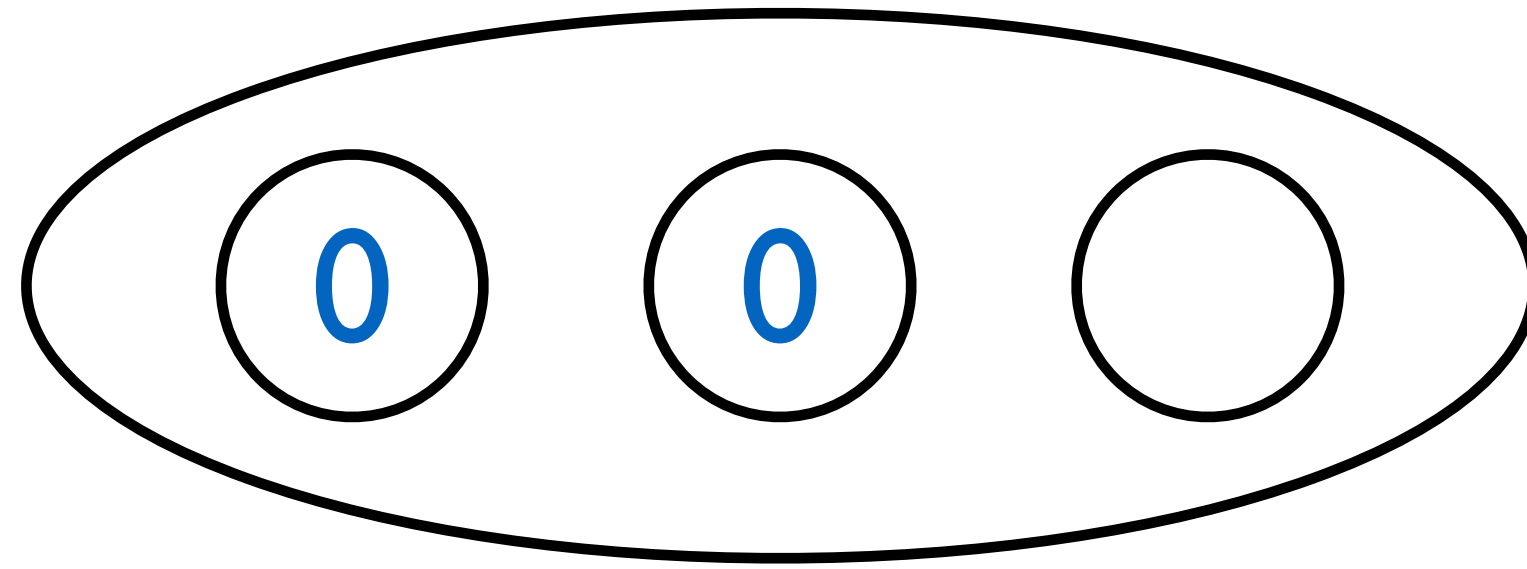
LO Colouring



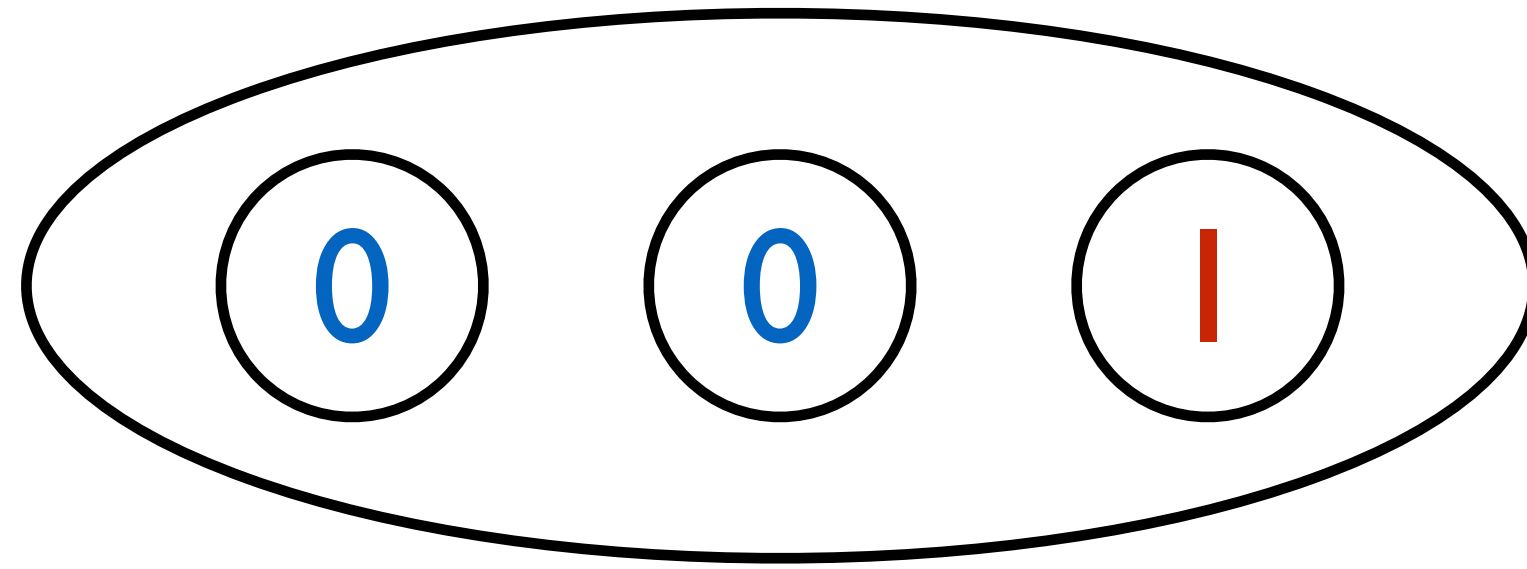
LO Colouring



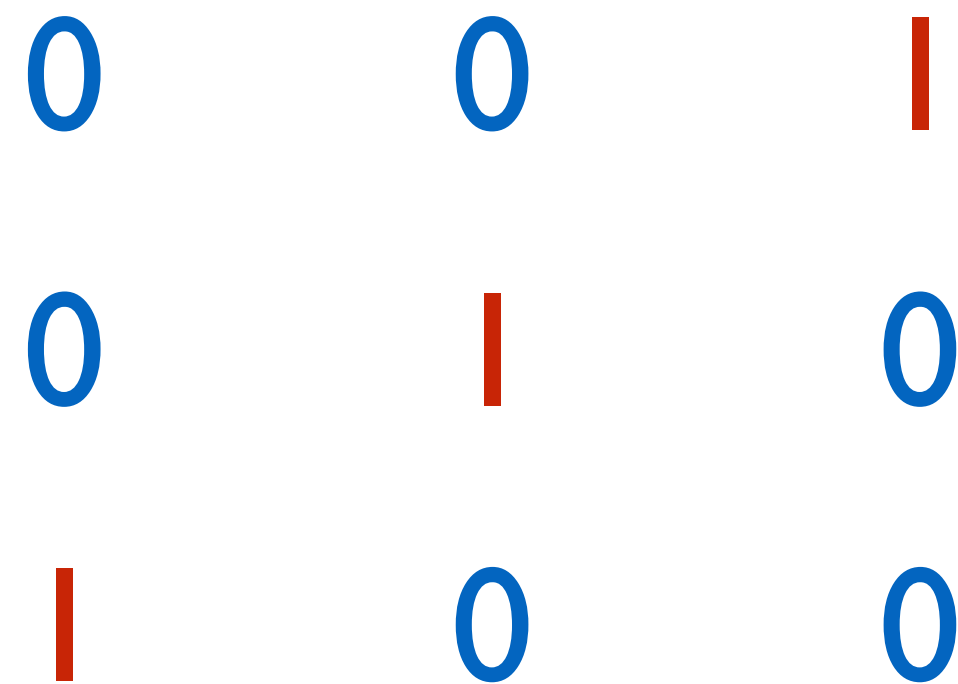
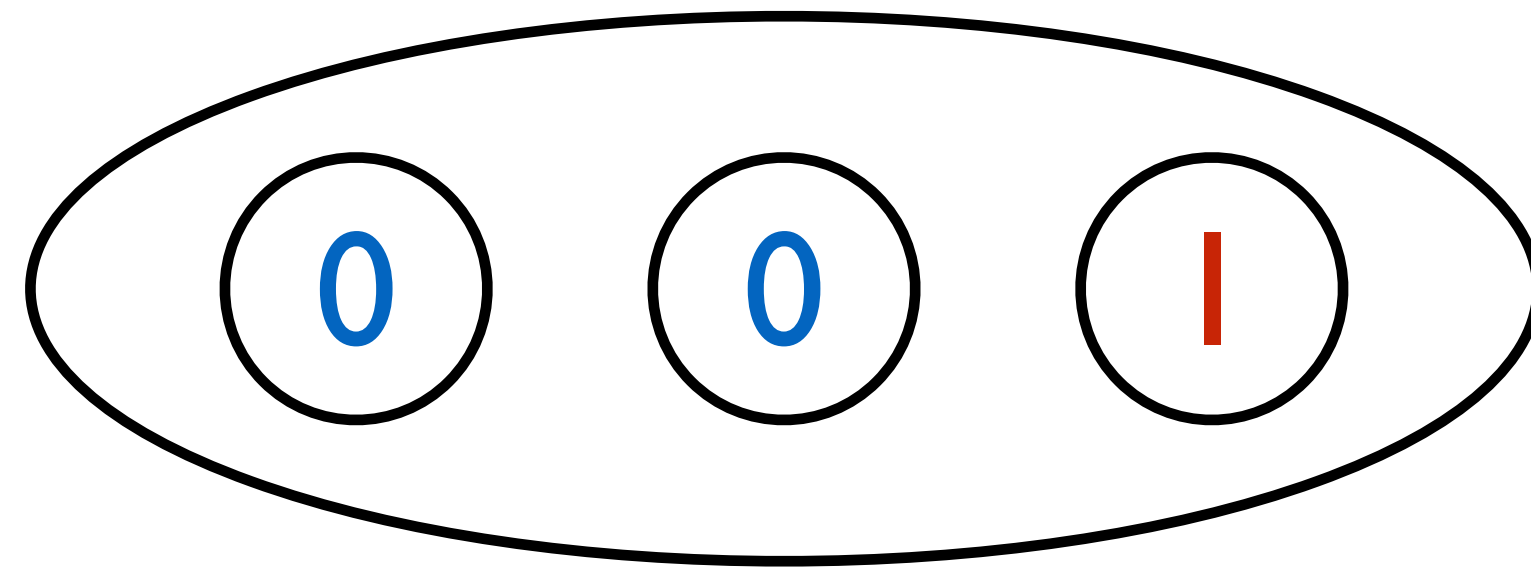
LO Colouring



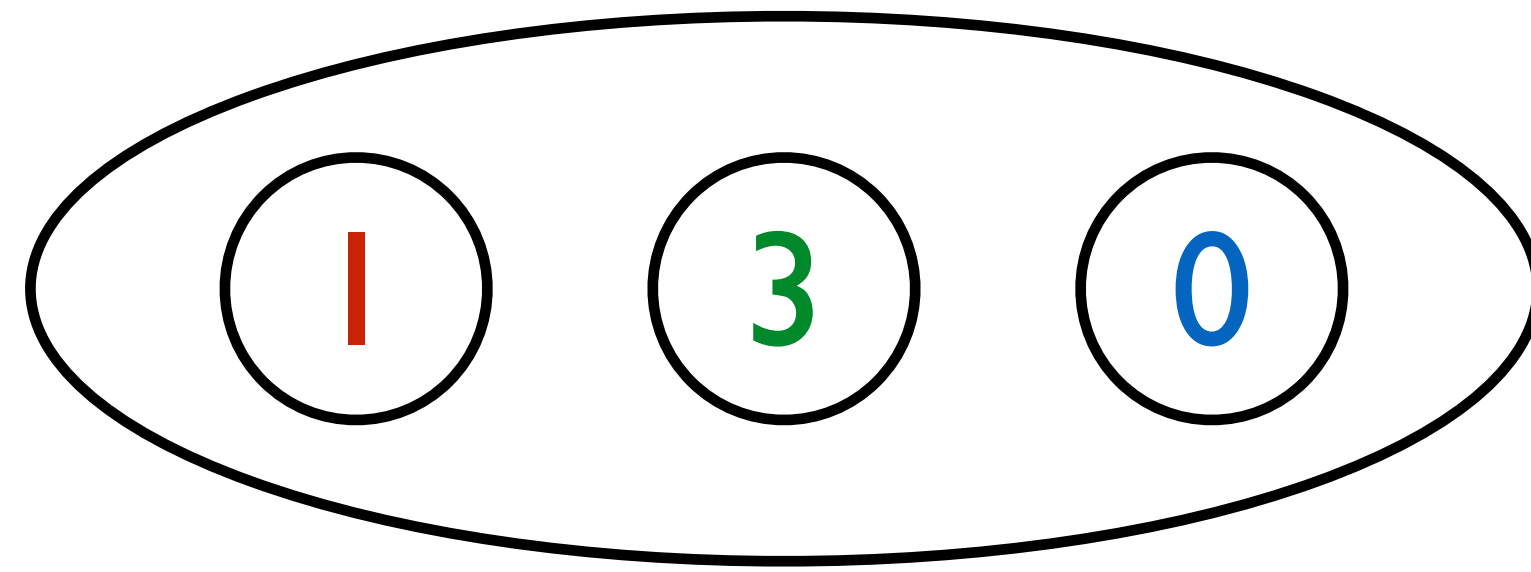
LO Colouring



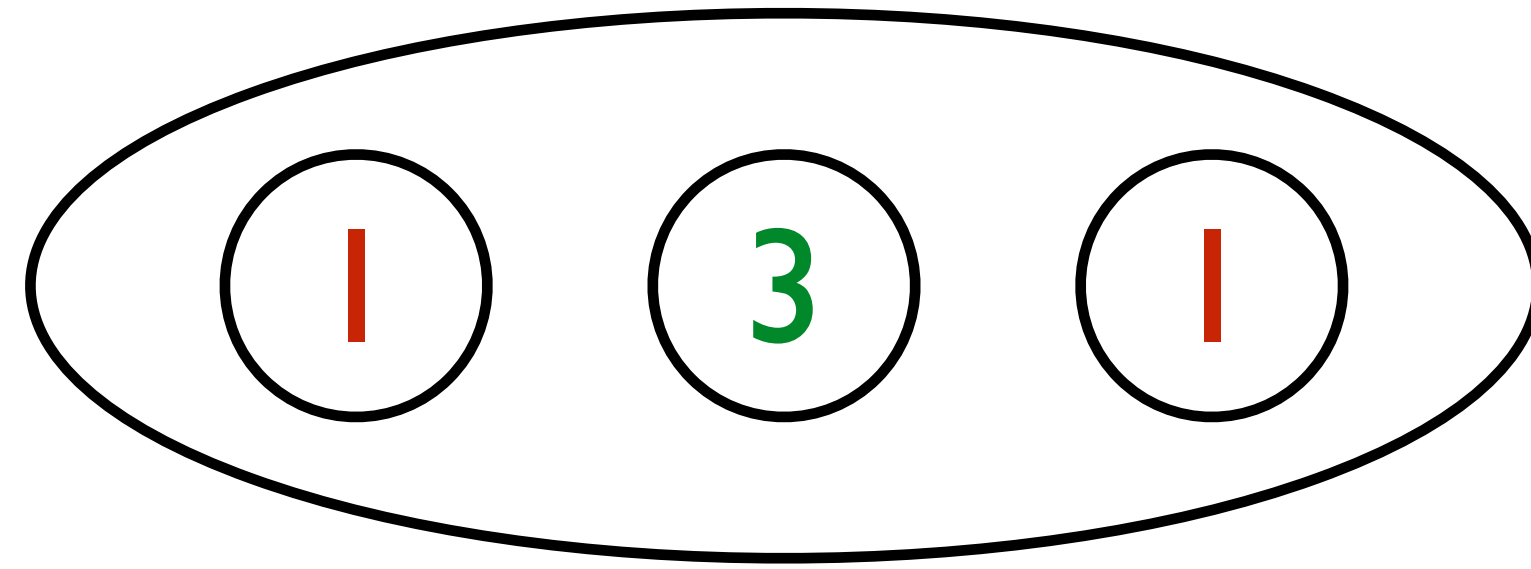
LO Colouring



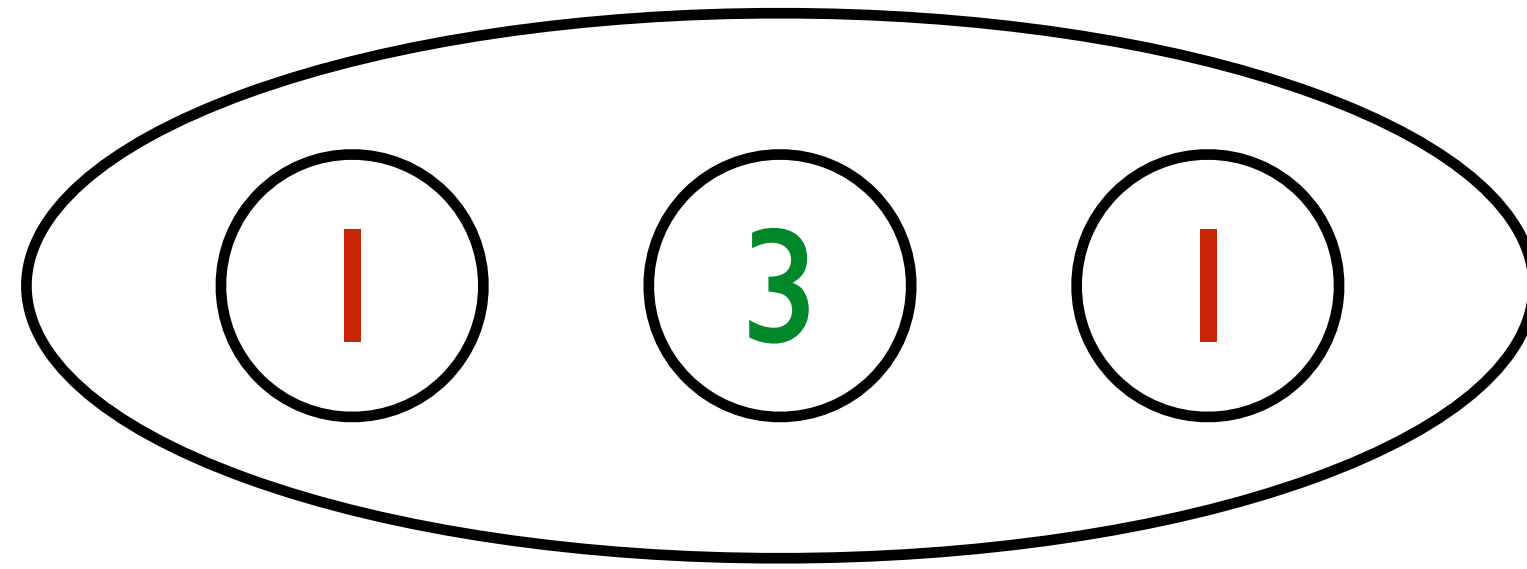
LO Colouring



LO Colouring

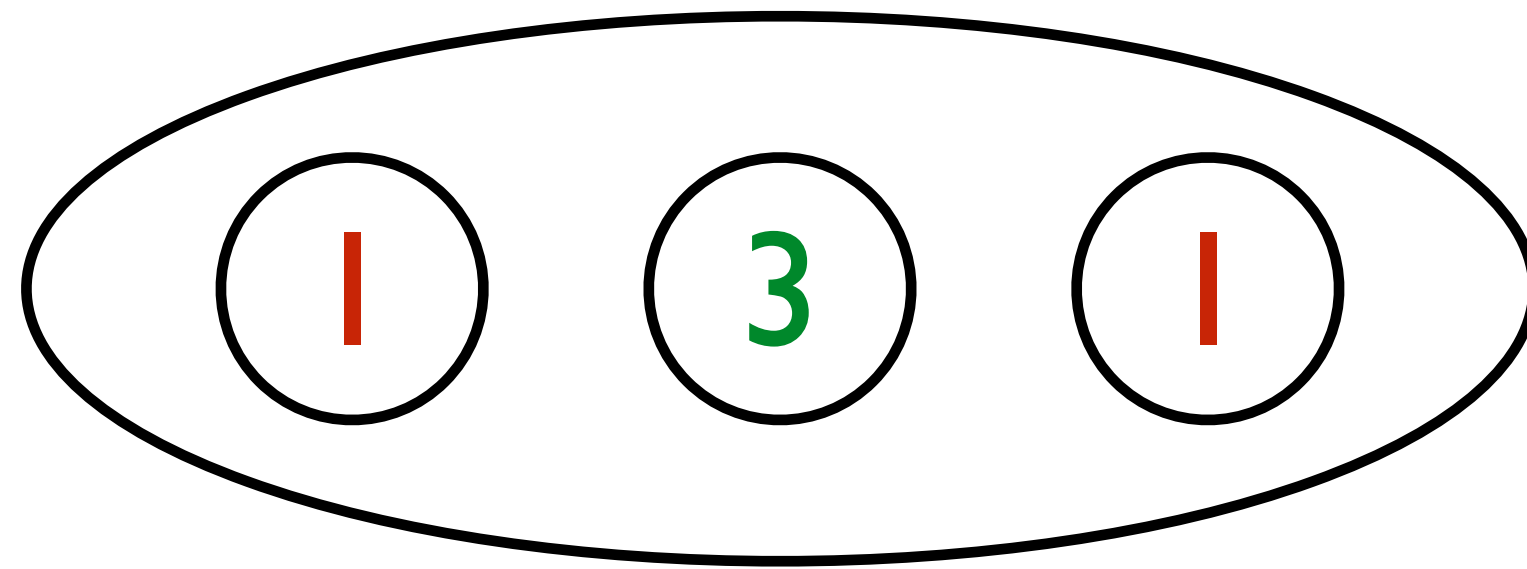


LO Colouring



Find a c -LO-colouring of a k -LO-colourable 3-uniform hypergraph.

LO Colouring



Find a c -LO-colouring of a k -LO-colourable 3-uniform hypergraph.

Conjecture: NP-hard for every constant $c \geq k = 2$. [Barto-Battistelli-Berg STACS'21]

2. CSPs

Constraint Satisfaction Problems

IN: set of variables, set of labels, set of constraints

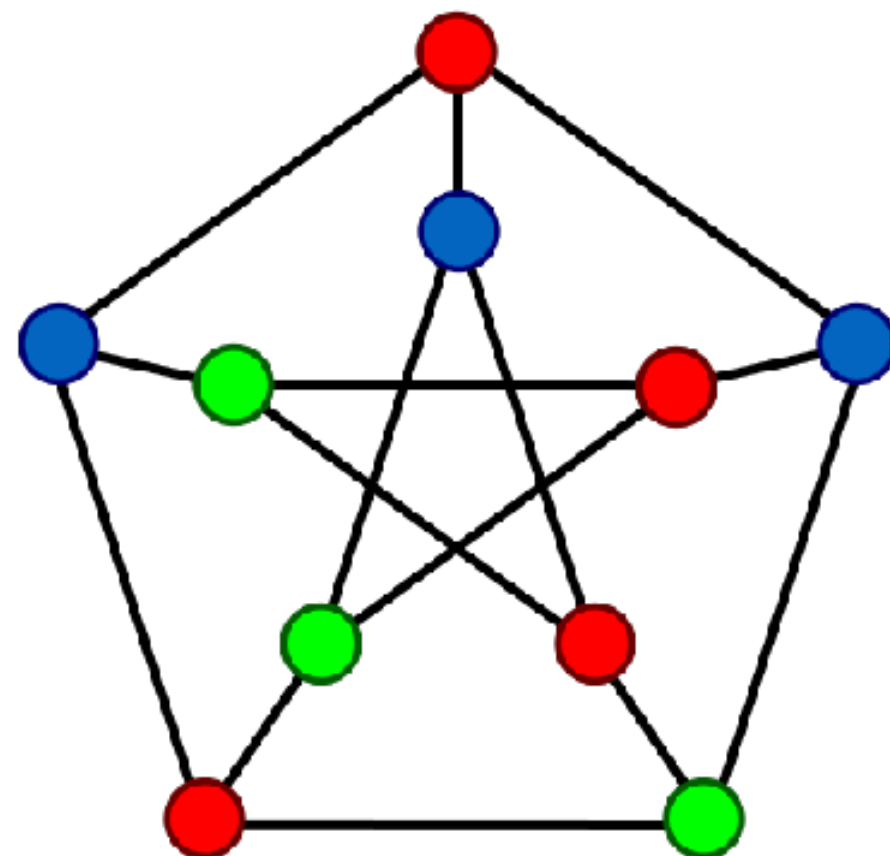
OUT: assignment that satisfies the given constraints

Constraint Satisfaction Problems

IN: set of variables, set of labels, set of constraints

OUT: assignment that satisfies the given constraints

3-Colour



Constraint Satisfaction Problems

IN: set of variables, set of labels, set of constraints

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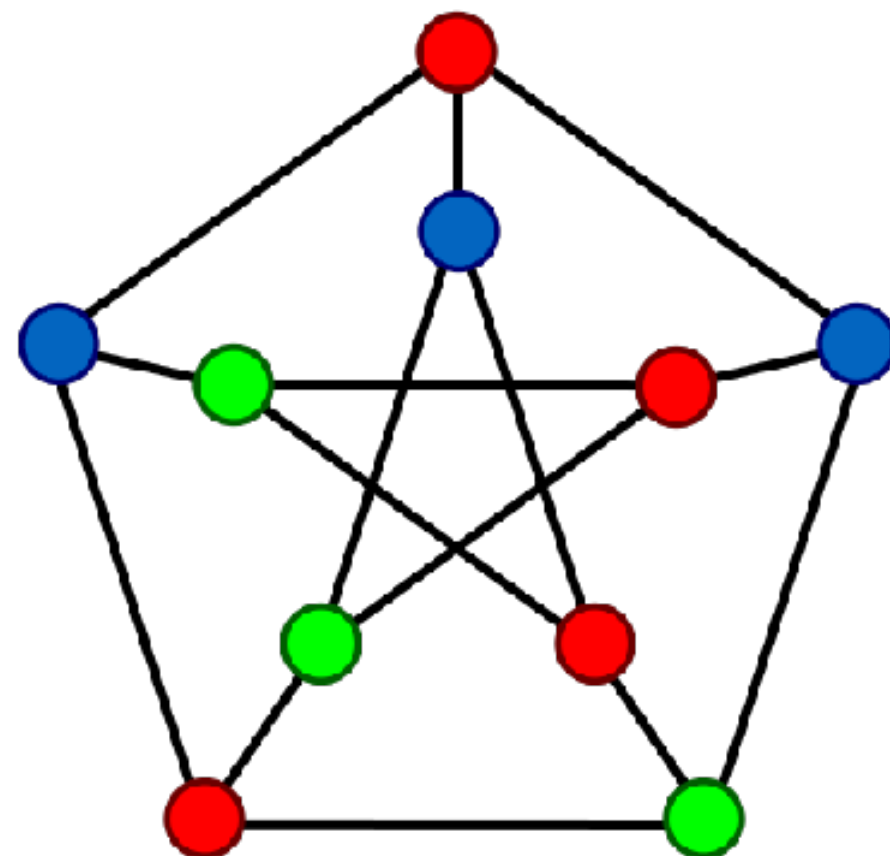
1-in-3-SAT

$$(x_1 \vee x_2 \vee x_5)$$

$$(x_2 \vee x_3 \vee x_7)$$

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3-Colour



Constraint Satisfaction Problems

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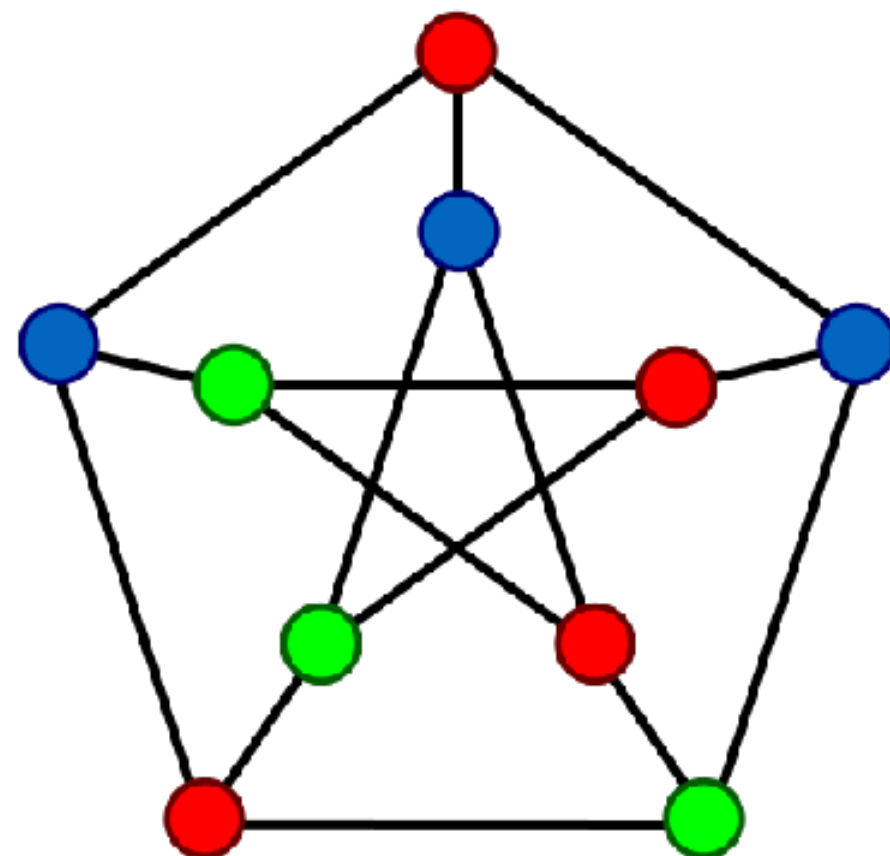
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$$(x_1 \vee x_2 \vee x_5)$$

$$(x_2 \vee x_3 \vee x_7)$$

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3-Colour



Linear Equations

$$x_1 + x_2 + x_3 + x_4 = 1$$

$$x_2 + x_4 + x_5 = 0$$

$$x_1 + x_3 + x_4 + x_6 = 2$$

Constraint Satisfaction Problems

IN: set of variables, set of labels, set of constraints

OUT: assignment that satisfies the given constraints

Constraint Satisfaction Problems

IN: set of variables, set of labels, set of constraints

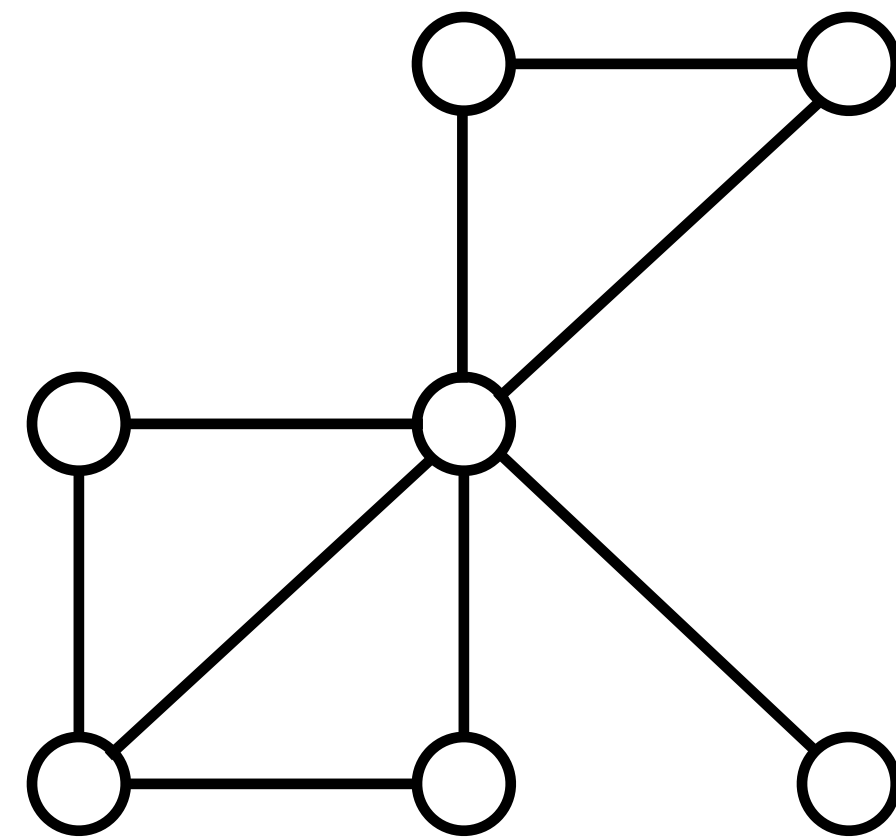
OUT: assignment that satisfies the given constraints

IN: two similar relational structures \mathbb{A} and \mathbb{B}

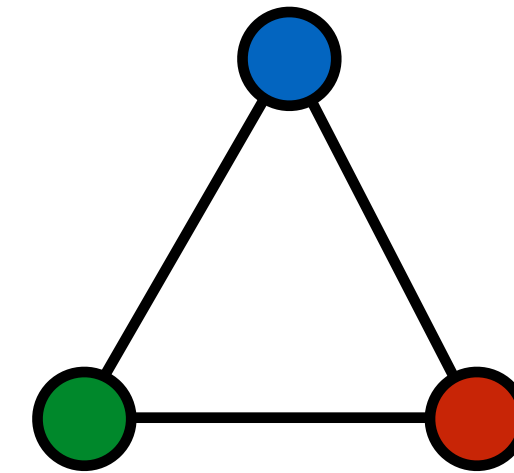
OUT: homomorphism from \mathbb{A} to \mathbb{B}

3-Colour

A

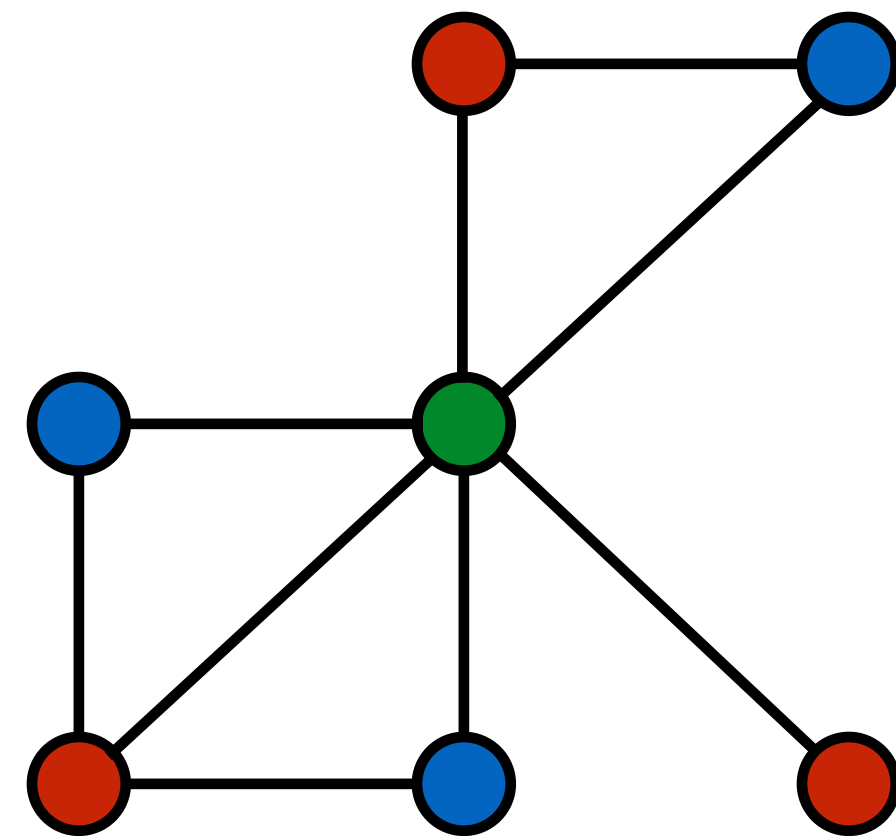


B

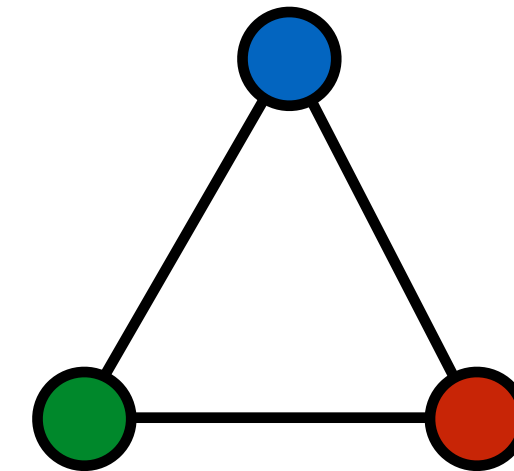


3-Colour

A



B



CSPs

IN: two similar relational structures \mathbb{A} and \mathbb{B}

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IN: two similar relational structures \mathbb{A} and \mathbb{B}

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$\text{CSP}(\mathbb{B})$

CSPs

IN: two similar relational structures \mathbb{A} and \mathbb{B}

OUT: homomorphism from \mathbb{A} to \mathbb{B}

CSP(\mathbb{B})

Boolean \mathbb{B} [Schaefer STOC'78]

graph \mathbb{B} [Hell-Nešetřil JCTB'90]

dichotomy conjecture [Feder-Vardi SICOMP'98]

⋮

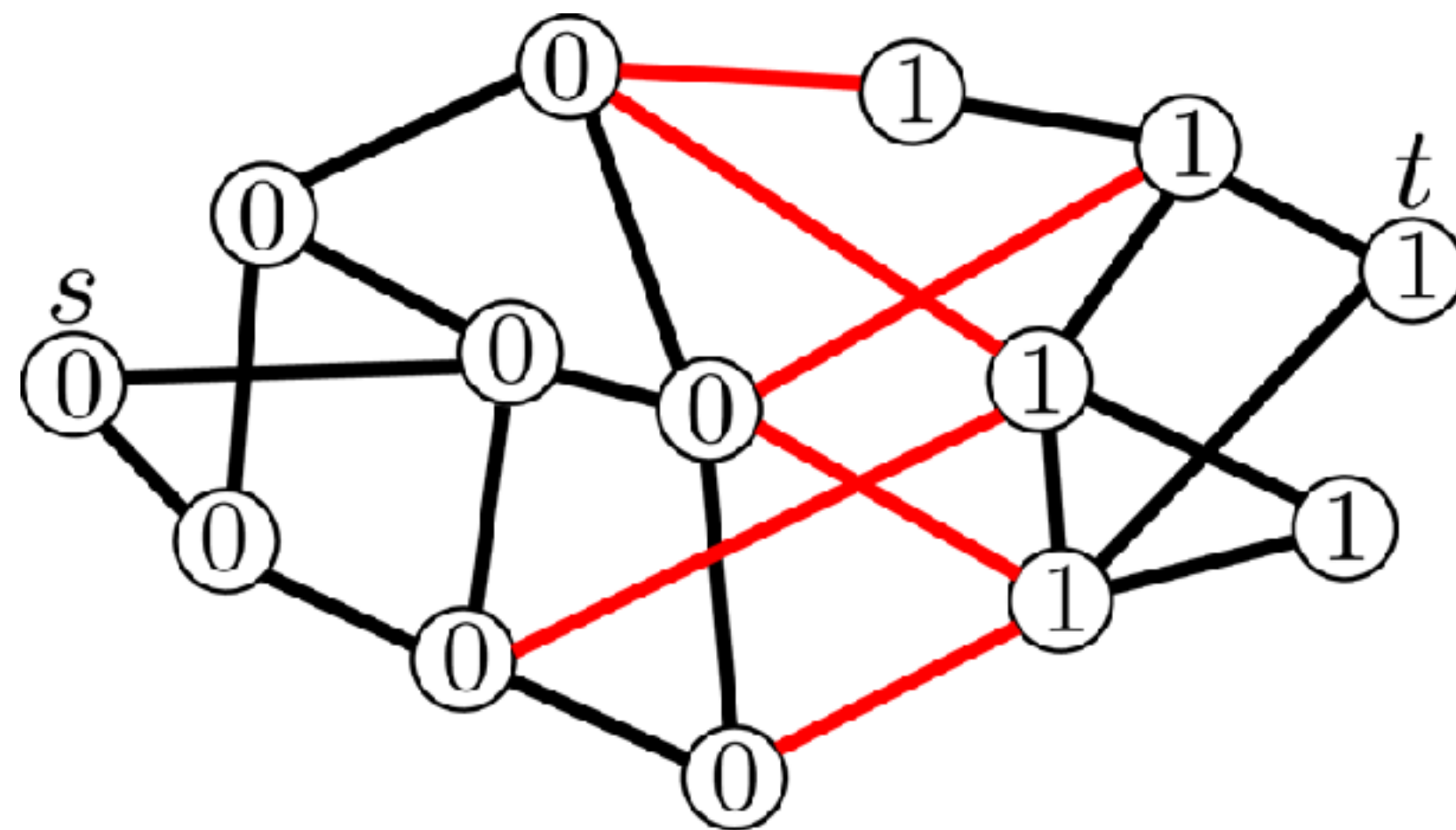
any finite \mathbb{B} [Bulatov FOCS'17, Zhuk JACM'20]

CSPs

IN: two similar relational structures \mathbb{A} and \mathbb{B}

OUT: homomorphism from \mathbb{A} to \mathbb{B}

Max-Cut

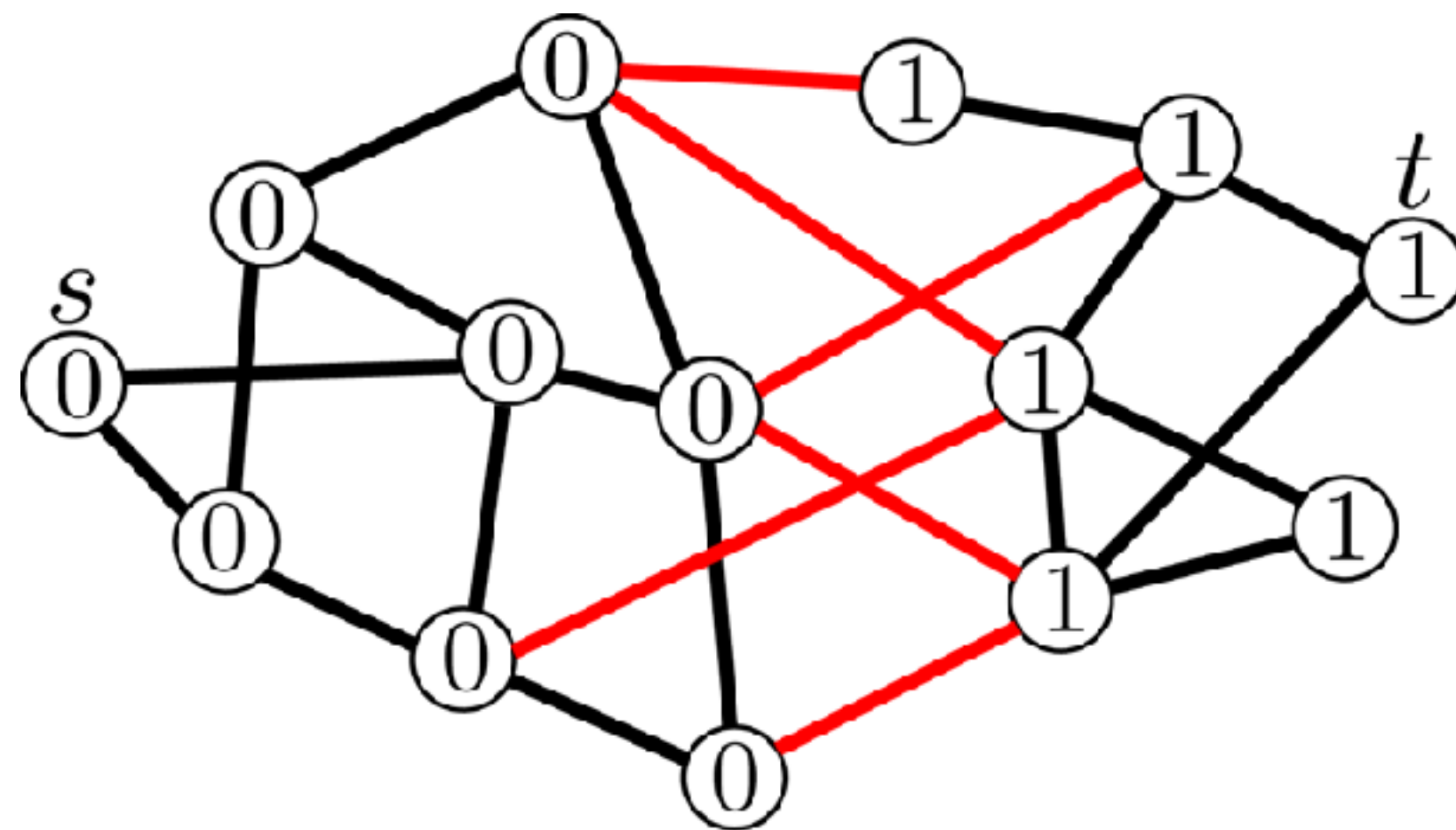


CSPs

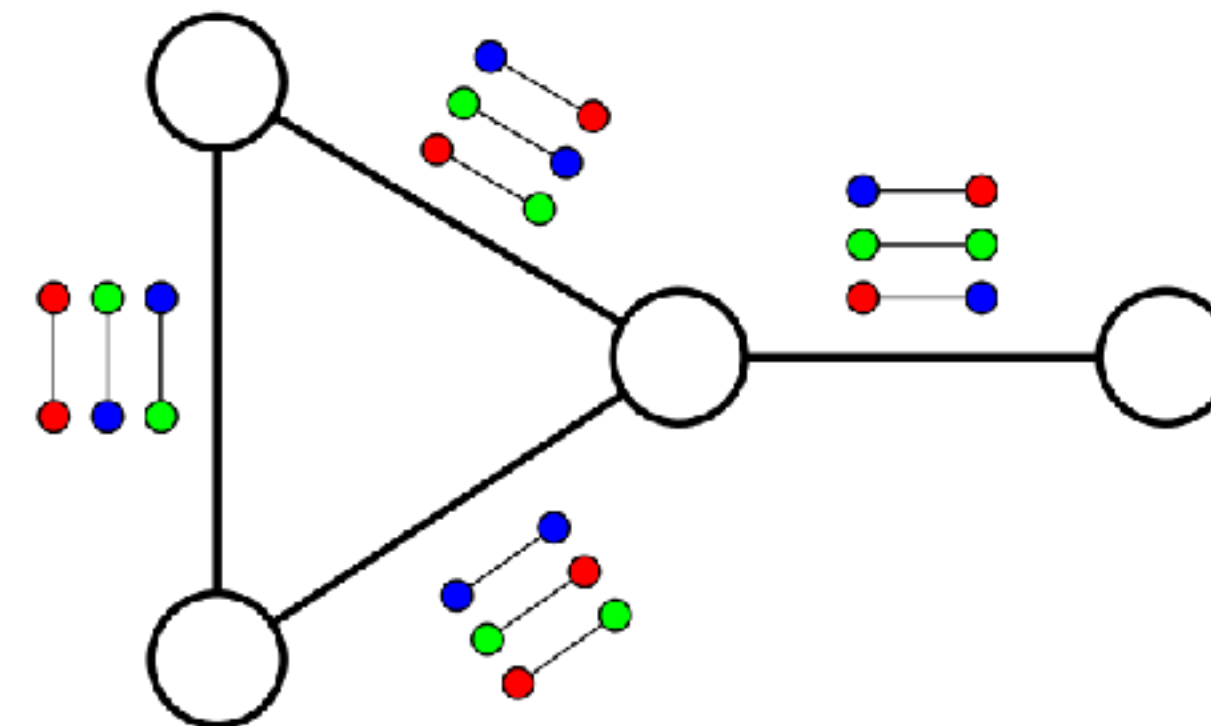
IN: two similar relational structures \mathbb{A} and \mathbb{B}

OUT: homomorphism from \mathbb{A} to \mathbb{B}

Max-Cut



UGC

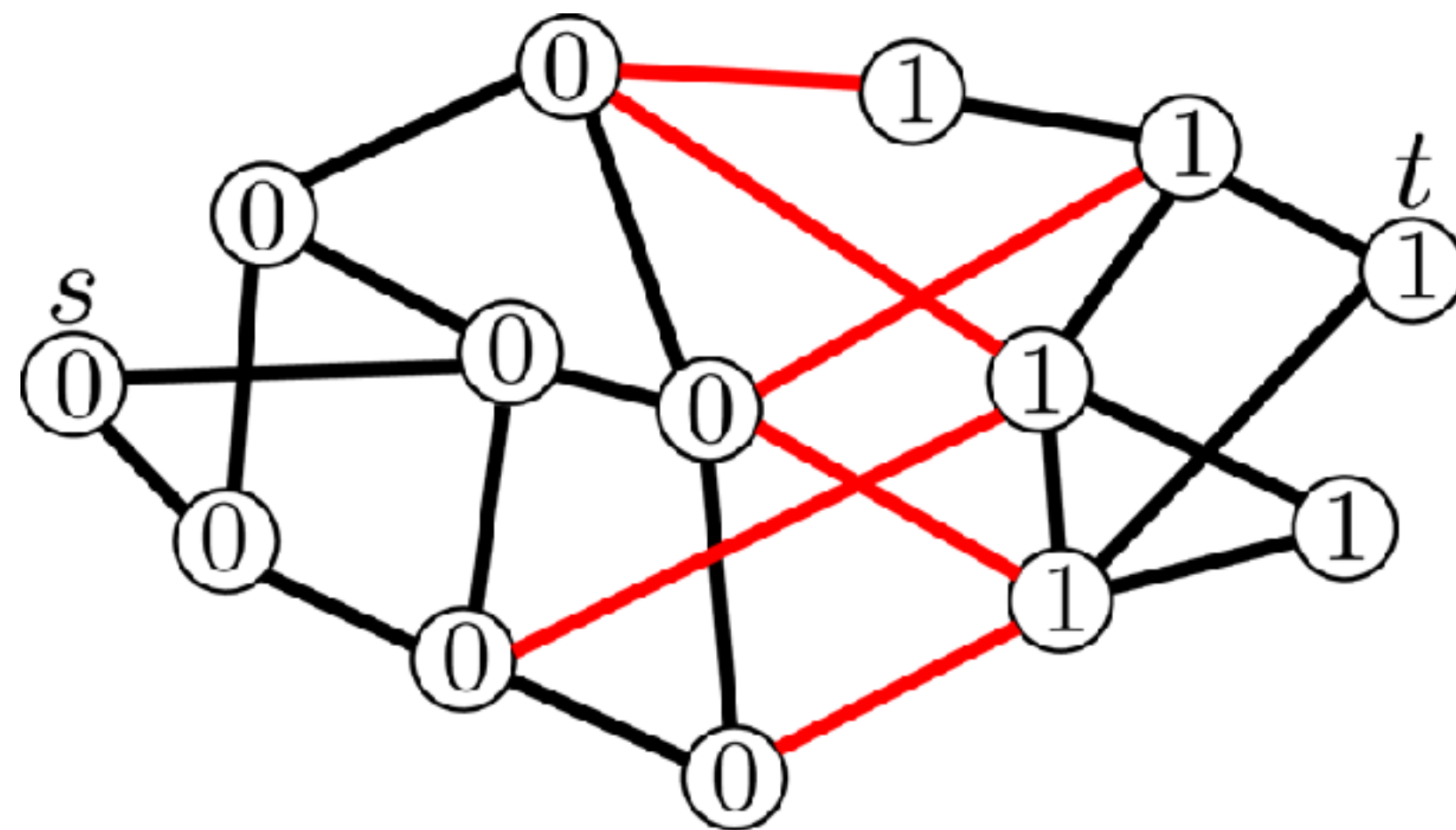


CSPs

IN: two similar relational structures \mathbb{A} and \mathbb{B}

OUT: homomorphism from \mathbb{A} to \mathbb{B}

(s,t)-Min-Cut

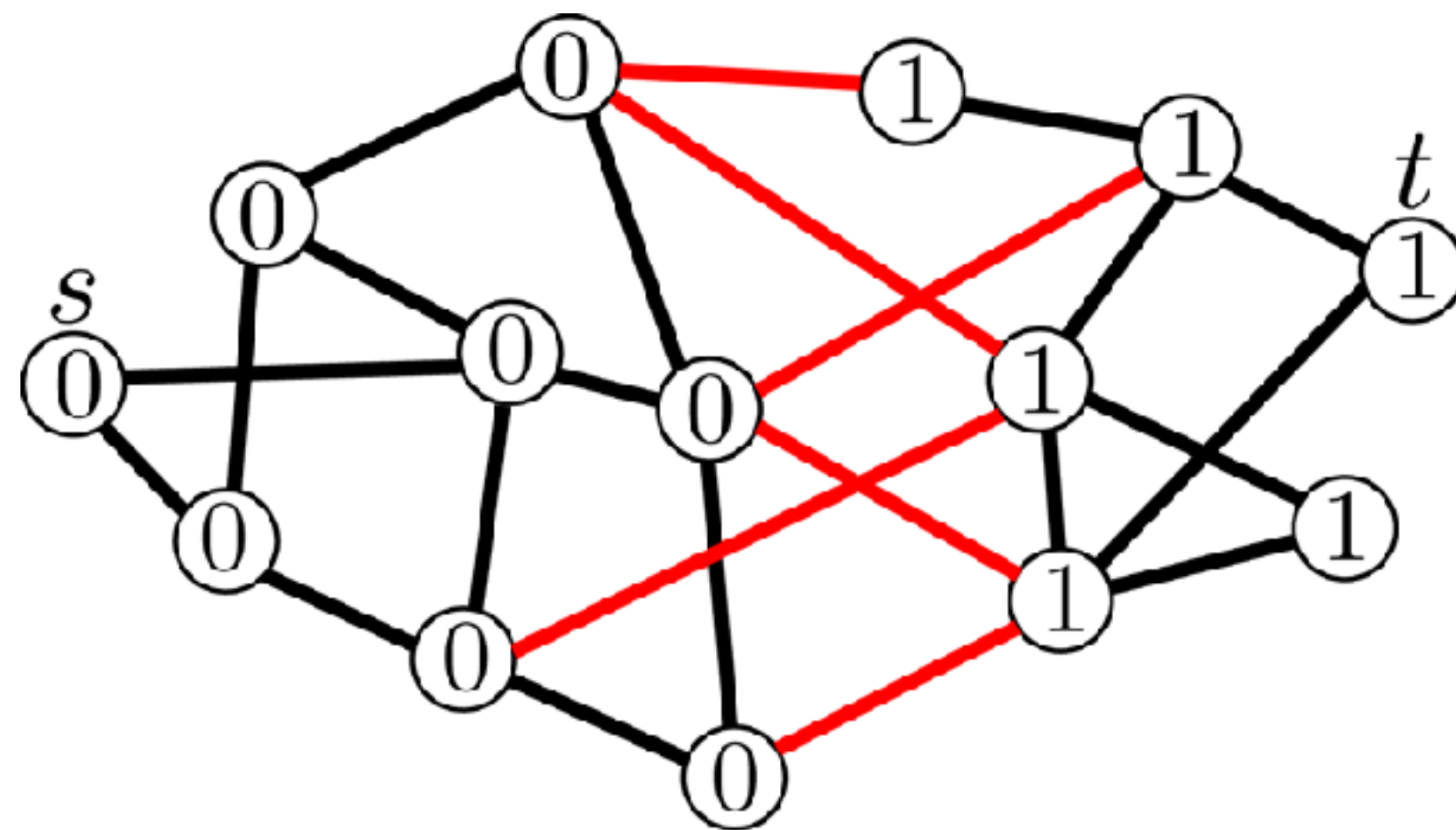


CSPs

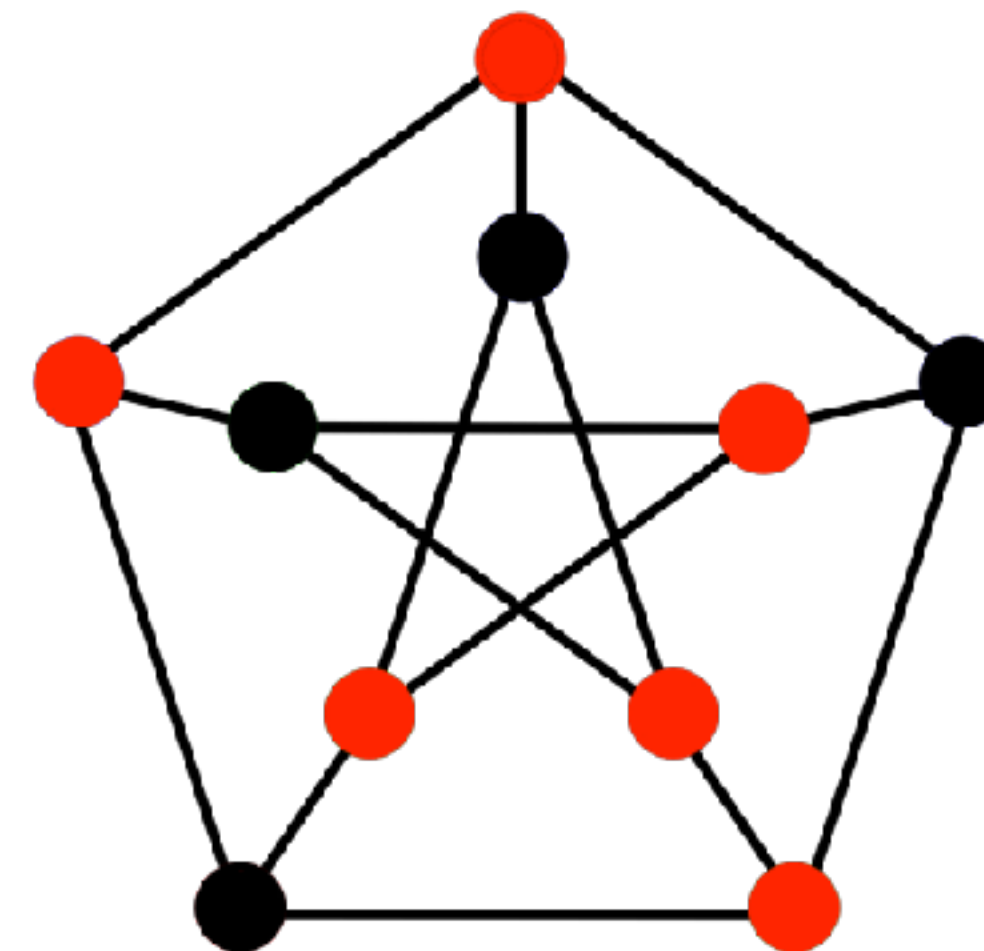
IN: two similar relational structures \mathbb{A} and \mathbb{B}

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(s,t)-Min-Cut



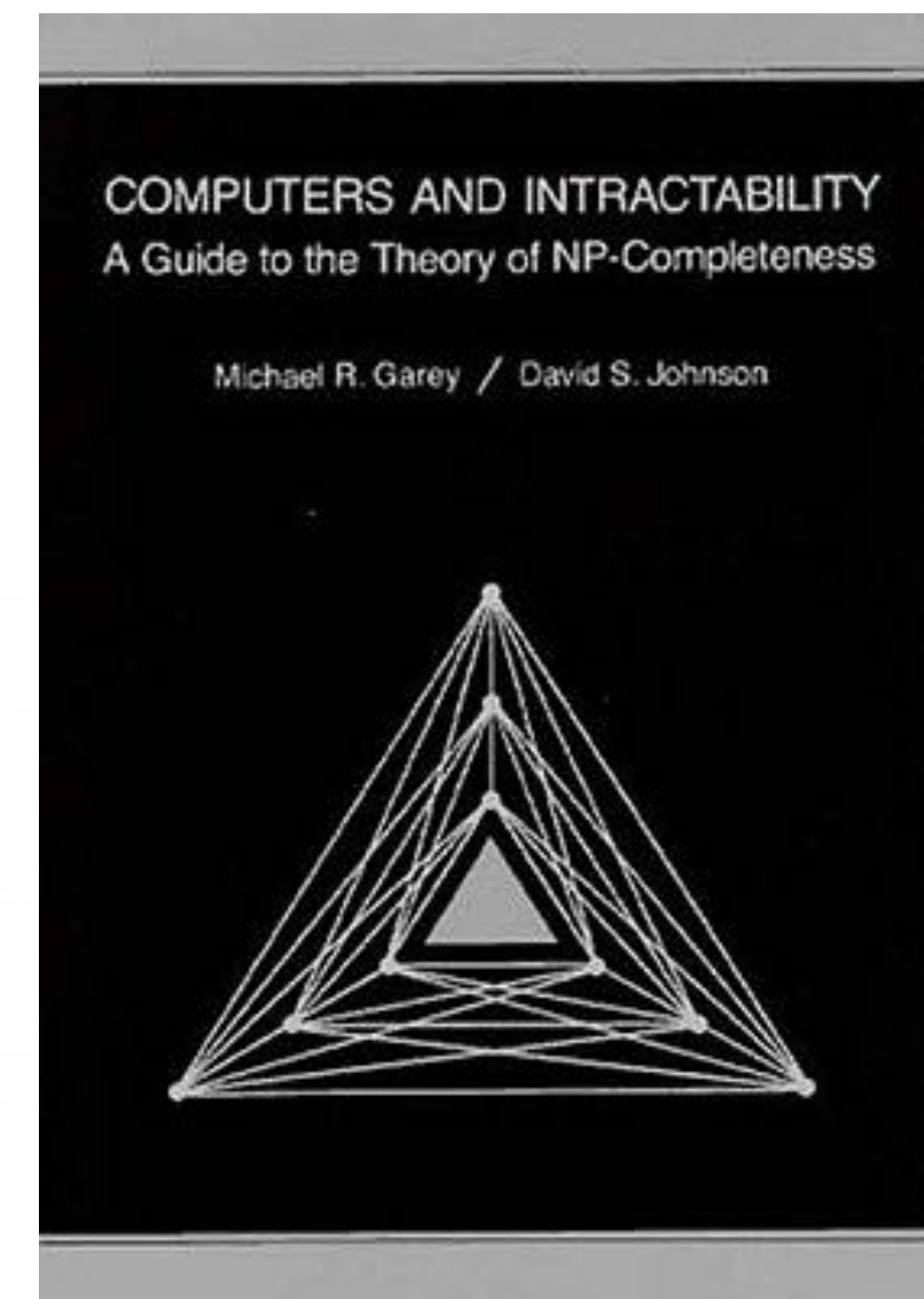
#Covers



How to Relax



“I can’t find an efficient algorithm, but neither can all these famous people.”



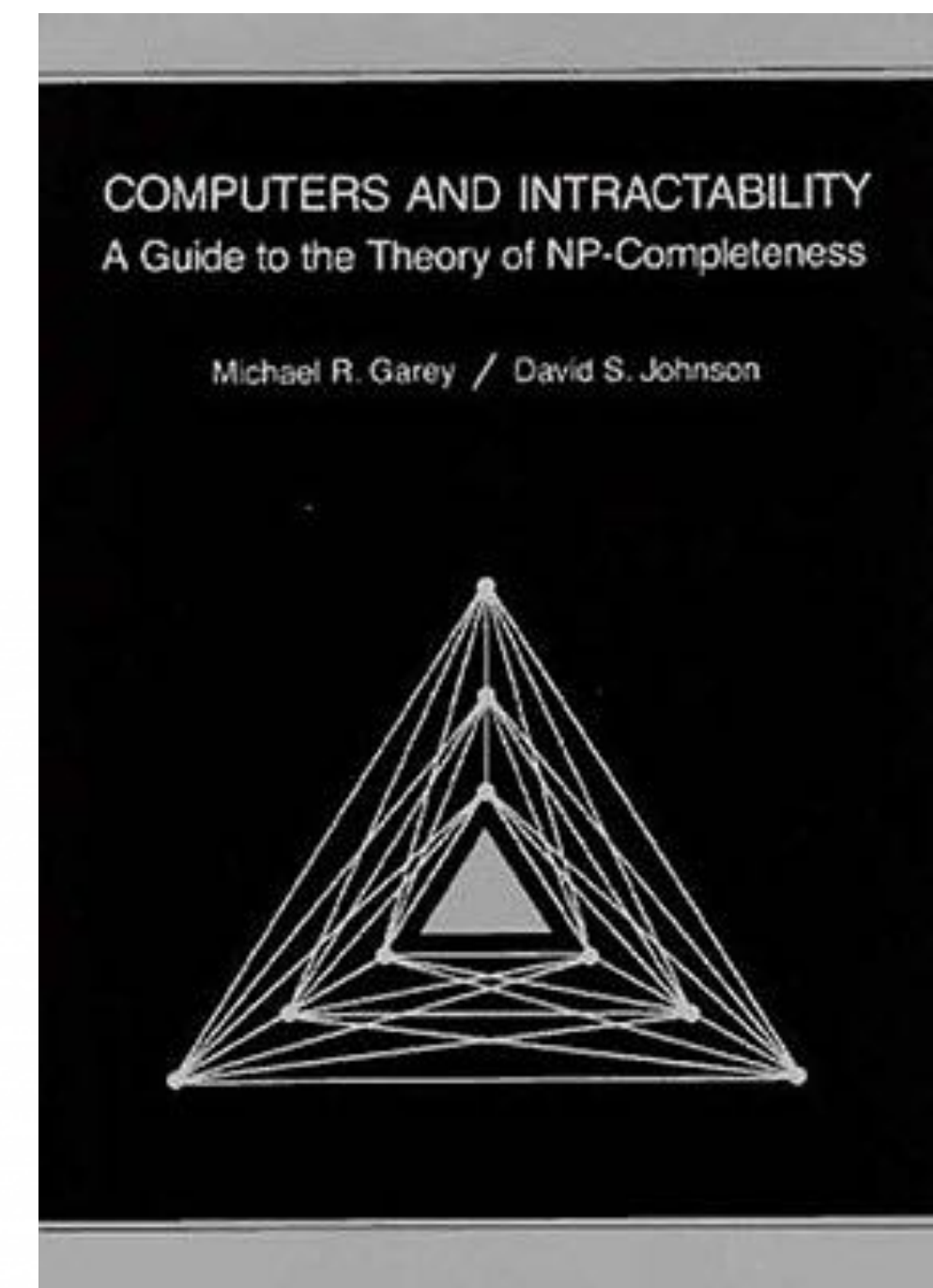
How to Relax



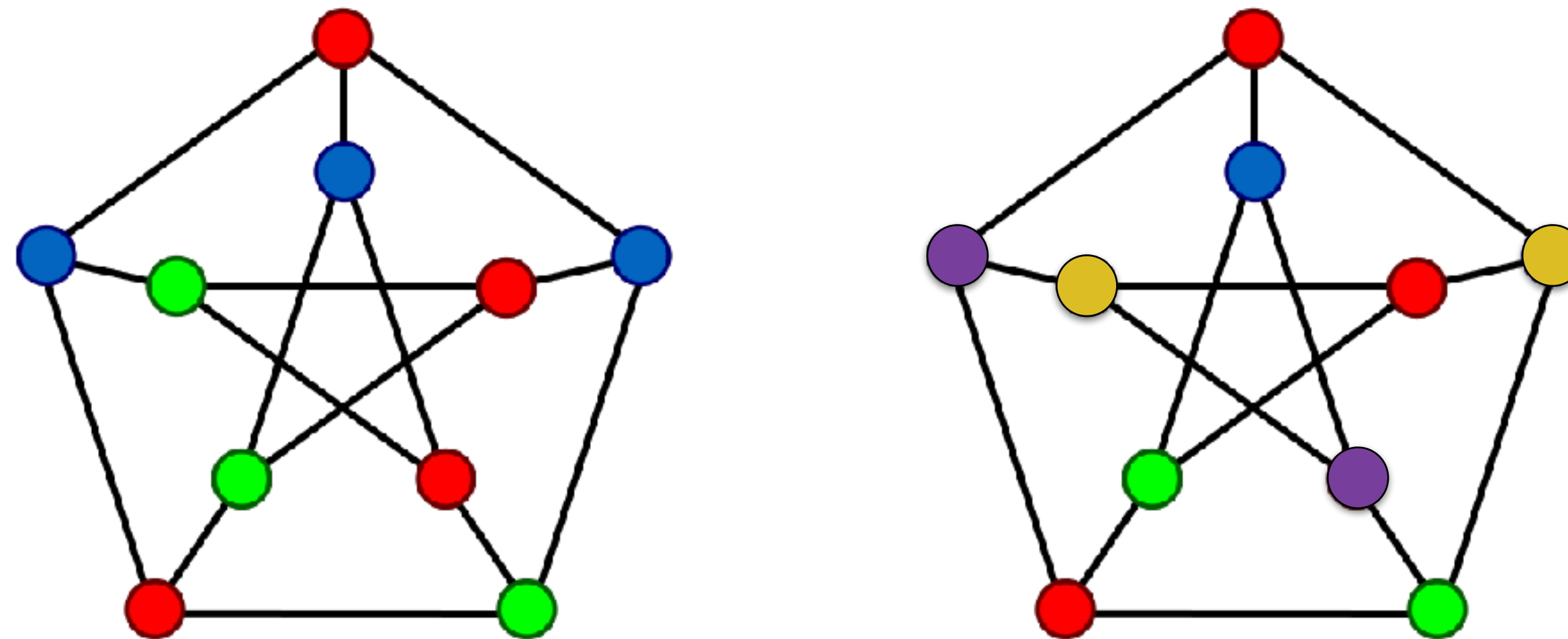
“I can’t find an efficient algorithm, but neither can all these famous people.”

Satisfy only a fraction of the constraints!

Satisfy a relaxed version of the constraints!



Approximate Graph Colouring



Find a c -colouring of a k -colourable graph ($c \geq k \geq 3$).

Promise CSPs

IN:	set of variables, set of labels, set of strict and weak constraints
PROMISE:	exists assignment using strict constraints
OUT:	assignment using weak constraints

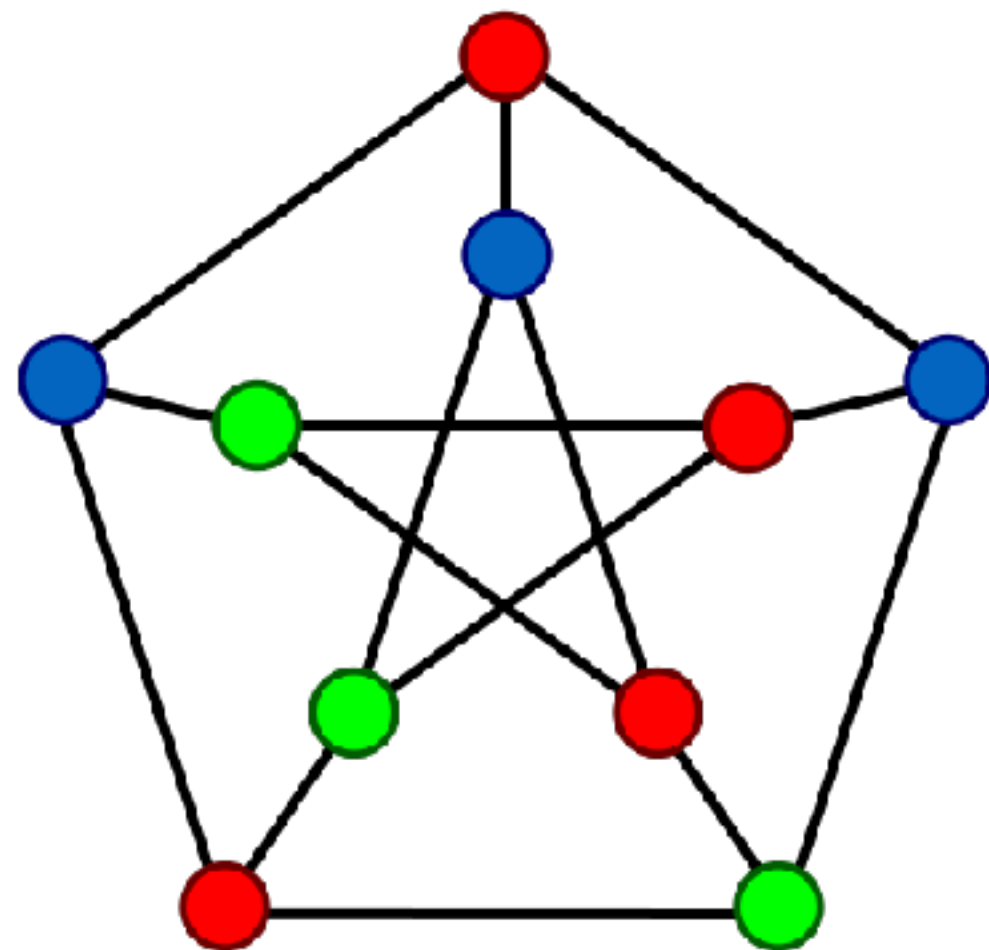
Promise CSPs

IN: set of variables, set of labels,
set of **strict** and **weak** constraints

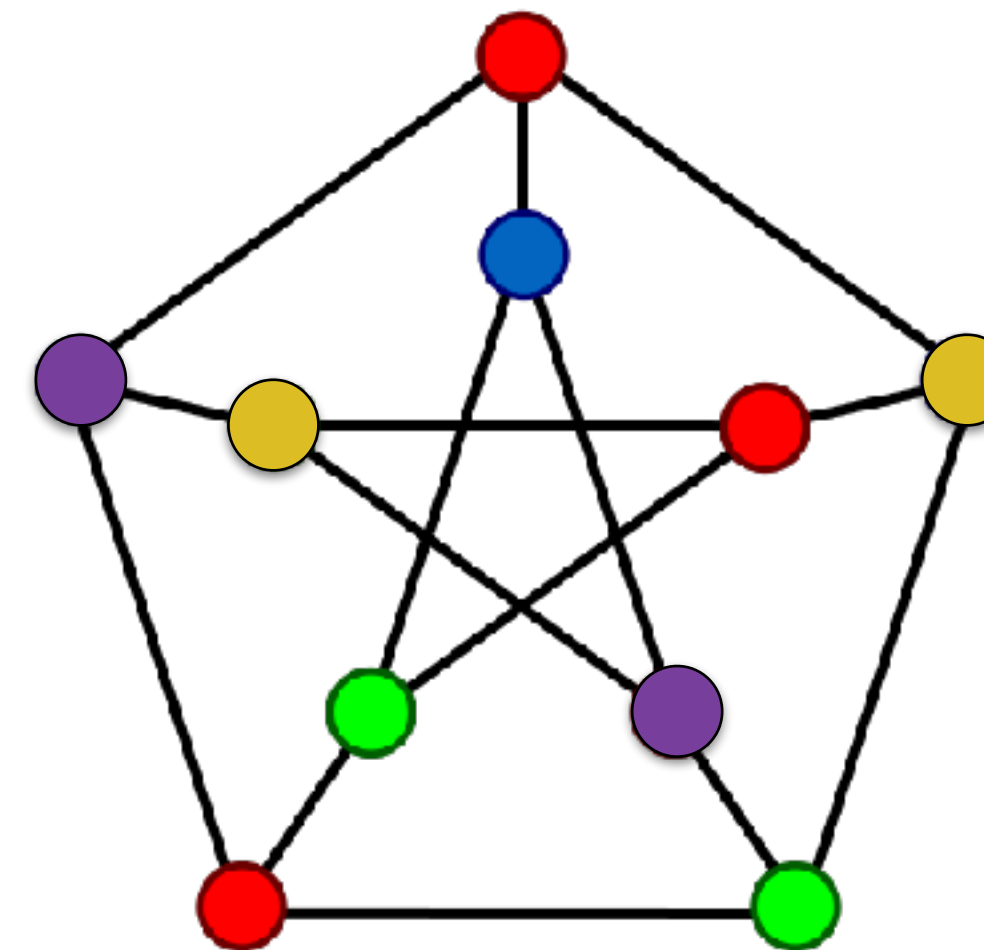
PROMISE: exists assignment using **strict** constraints

OUT: assignment using **weak** constraints

3-Colour



5-Colour



Promise CSPs

IN:	set of variables, set of labels, set of strict and weak constraints
PROMISE:	exists assignment using strict constraints
OUT:	assignment using weak constraints

1-in-3-SAT

(1,0,0)
(0,1,0)
(0,0,1)

(x, y, z)

NAE-3-SAT

(1,0,0)
(0,1,0)
(0,0,1)
(1,1,0)
(1,0,1)
(0,1,1)

PCSP(A, B)

IN:	set of variables, set of labels, set of strict and weak constraints
PROMISE:	exists assignment using strict constraints
OUT:	assignment using weak constraints

PCSP(A, B)



A → B

IN:	set of variables, set of labels, set of strict and weak constraints
PROMISE:	exists assignment using strict constraints
OUT:	assignment using weak constraints

PCSP(A, B)

A → B

IN: set of variables, set of labels,
set of **strict** and **weak** constraints

PROMISE: exists assignment using **strict** constraints

OUT: assignment using **weak** constraints

IN: Γ

PROMISE: exists homomorphism from Γ to A

OUT: homomorphism from Γ to B

PCSP(A, B)

A → B

IN: set of variables, set of labels,
set of **strict** and **weak** constraints

PROMISE: exists assignment using **strict** constraints

OUT: assignment using **weak** constraints

search

IN: Γ

PROMISE: exists homomorphism from Γ to A

OUT: homomorphism from Γ to B

PCSP(A, B)

$A \rightarrow B$

search

IN: Γ

PROMISE: exists homomorphism from Γ to A

OUT: homomorphism from Γ to B

PCSP(A, B)

$A \rightarrow B$

decision

- IN:** Γ
- OUT YES:** if there is homomorphism from Γ to A
- OUT NO:** if there is no homomorphism from Γ to B

search

- IN:** Γ
- PROMISE:** exists homomorphism from Γ to A
- OUT:** homomorphism from Γ to B

PCSP(A, B)

$A \rightarrow B$

decision

IN: Γ
OUT YES: if there is homomorphism from Γ to A
OUT NO: if there is no homomorphism from Γ to B

\leq_p

search

IN: Γ
PROMISE: exists homomorphism from Γ to A
OUT: homomorphism from Γ to B

PCSP(A, B)

- $\text{PCSP}(A, A) = \text{CSP}(A)$
- $\text{PCSP}(A, B)$ in P if $\text{CSP}(A)$ in P or $\text{CSP}(B)$ in P
- $\text{PCSP}(A, B)$:
 - aproximability of $\text{CSP}(A)$ on satisfiable instances
 - $\text{CSP}(B)$ with restricted instances

3. Results

SetSAT

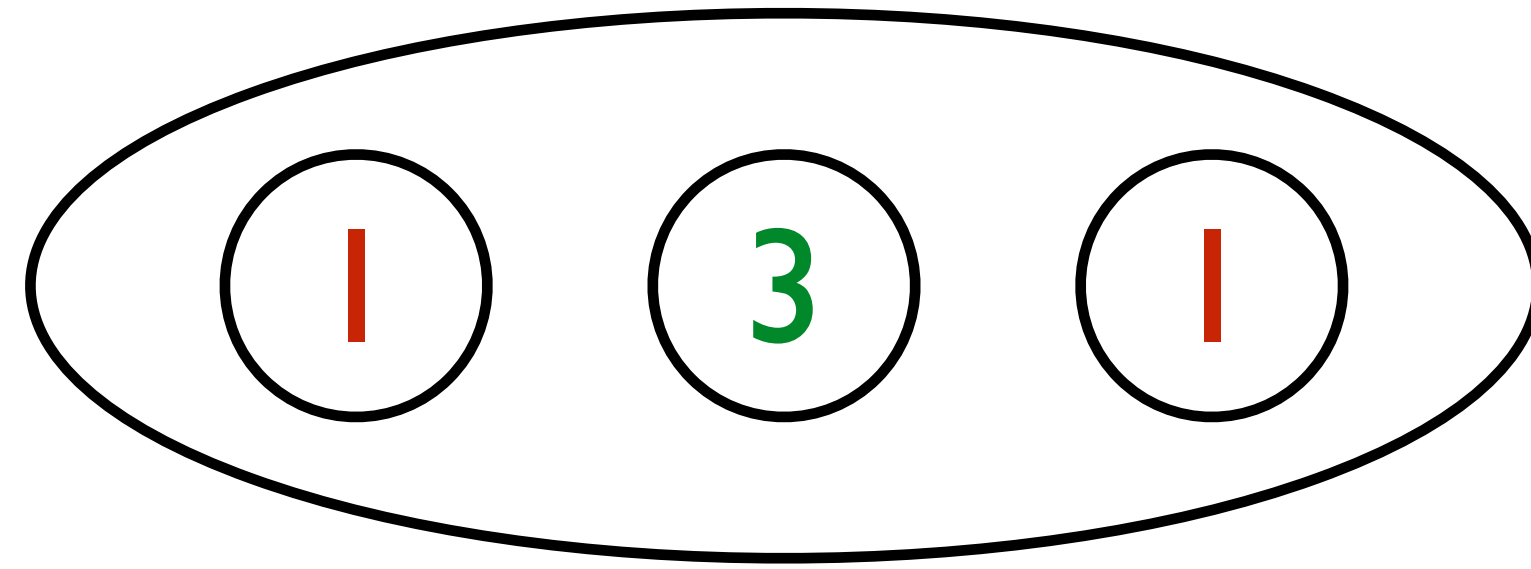
Thm: (l, g, k) -SAT in P if $\frac{g}{k} \geq \frac{1}{2}$ and NP-hard otherwise. [Austrin-Guruswami-Håstad SICOMP'17]

SetSAT

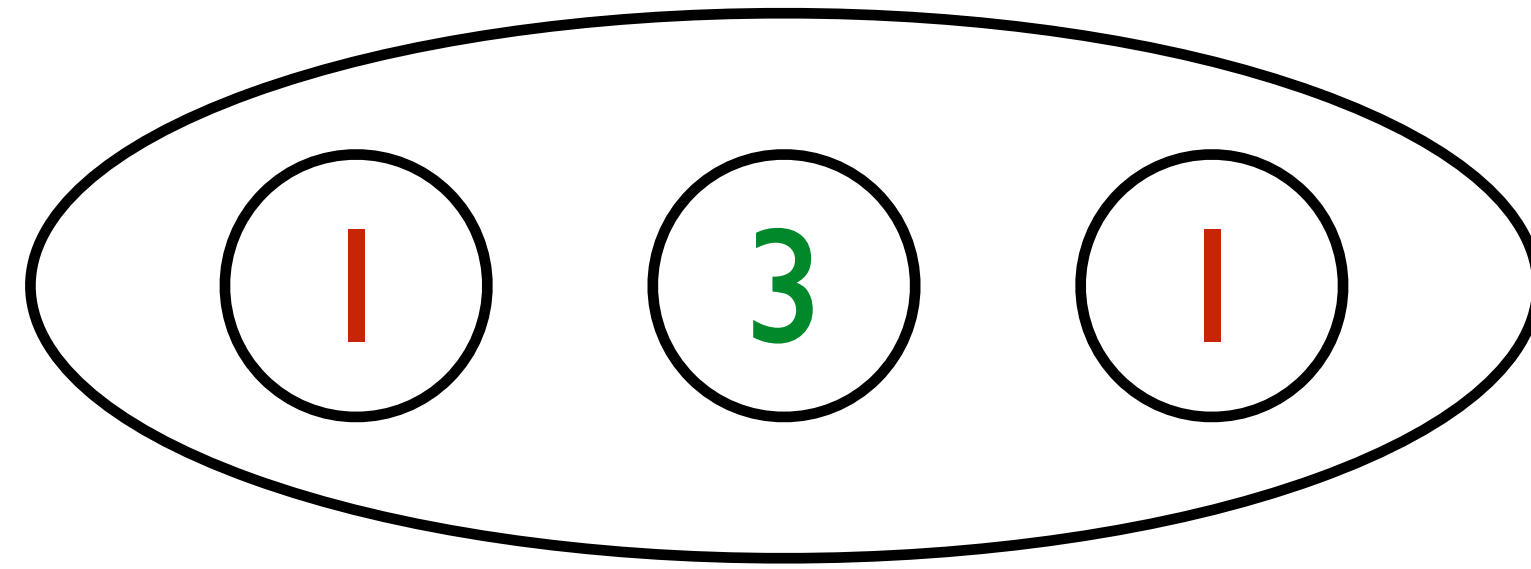
Thm: (l, g, k) -SAT in P if $\frac{g}{k} \geq \frac{1}{2}$ and NP-hard otherwise. [Austrin-Guruswami-Håstad SICOMP'17]

Thm: (l, g, k) -SetSAT in P if $\frac{g}{k} \geq \frac{s}{s+1}$ and NP-hard otherwise. [Brandts-Wrochna-Živný ACM ToCT'21]

LO Colouring

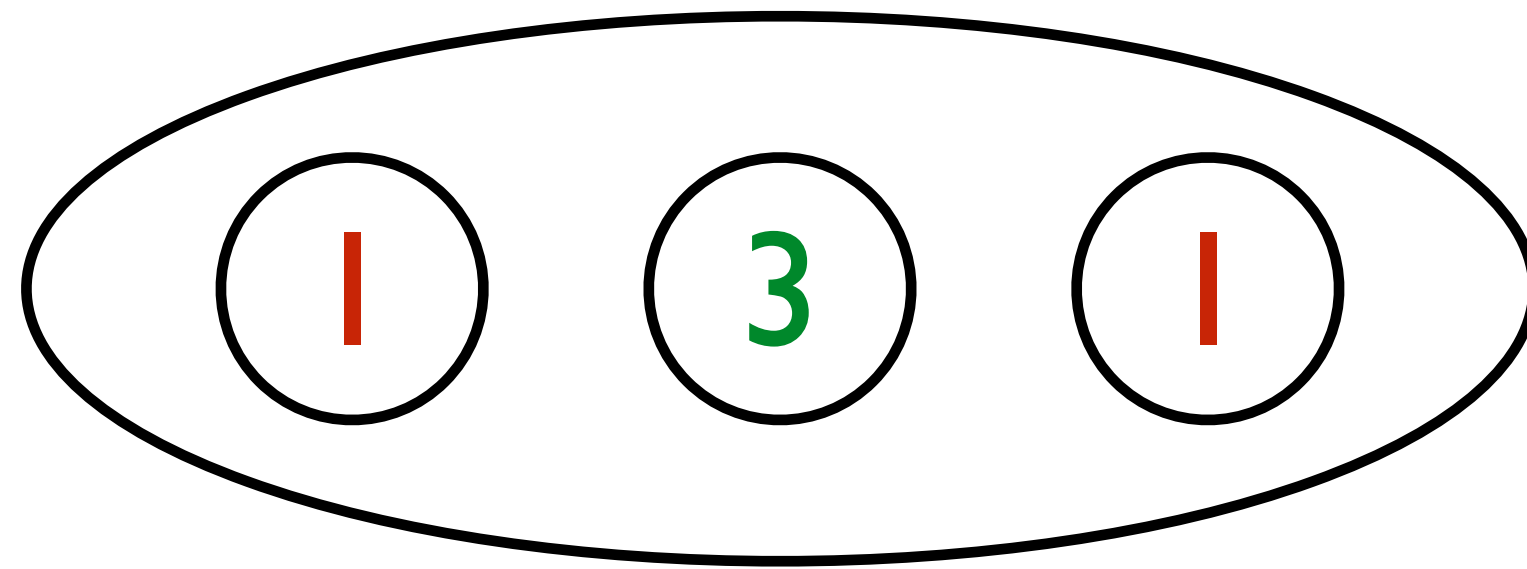


LO Colouring



unique maximum

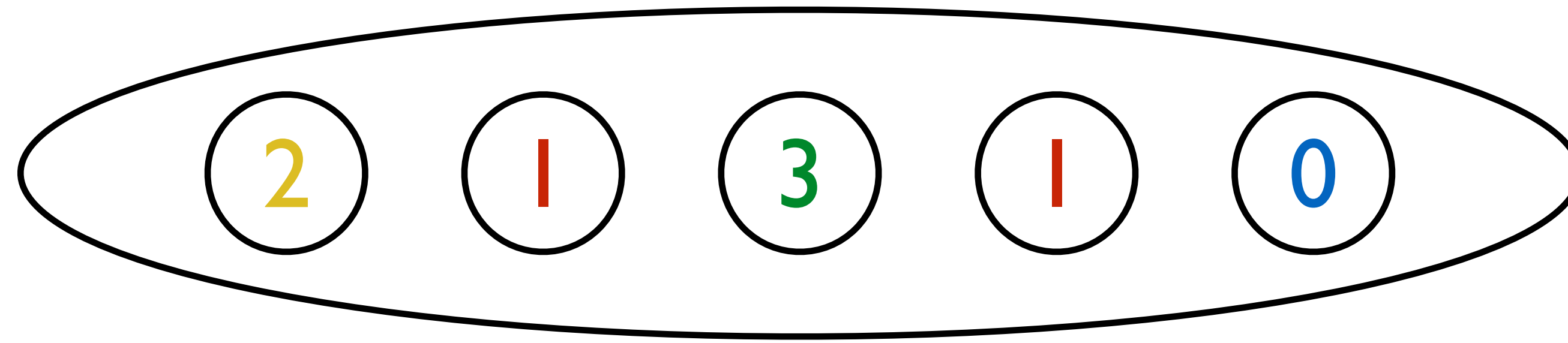
LO Colouring



unique maximum

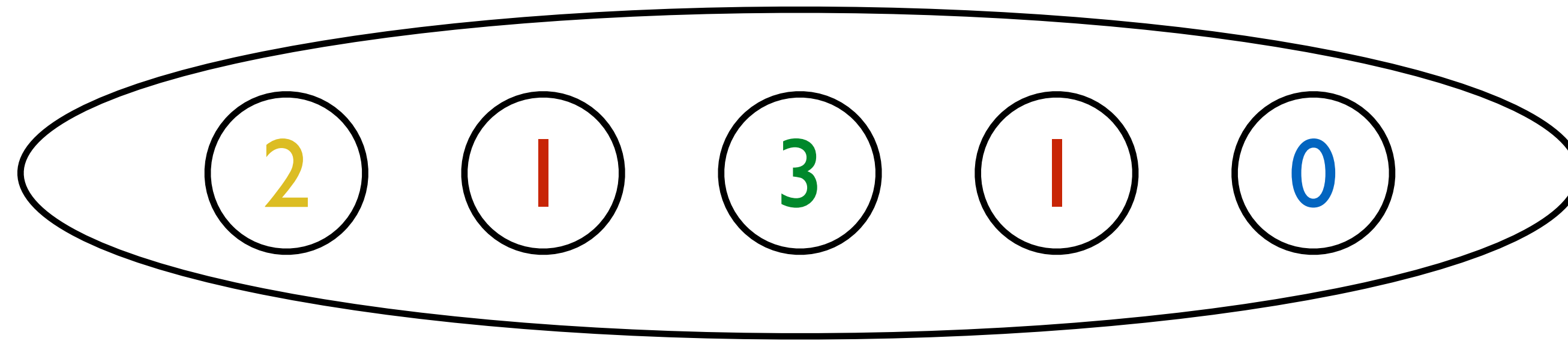
Problem: Complexity of $\text{PCSP}(\text{LO}_2, \text{LO}_c)$? [Barto-Battistelli-Berg STACS'21]

LO Colouring



unique maximum

LO Colouring



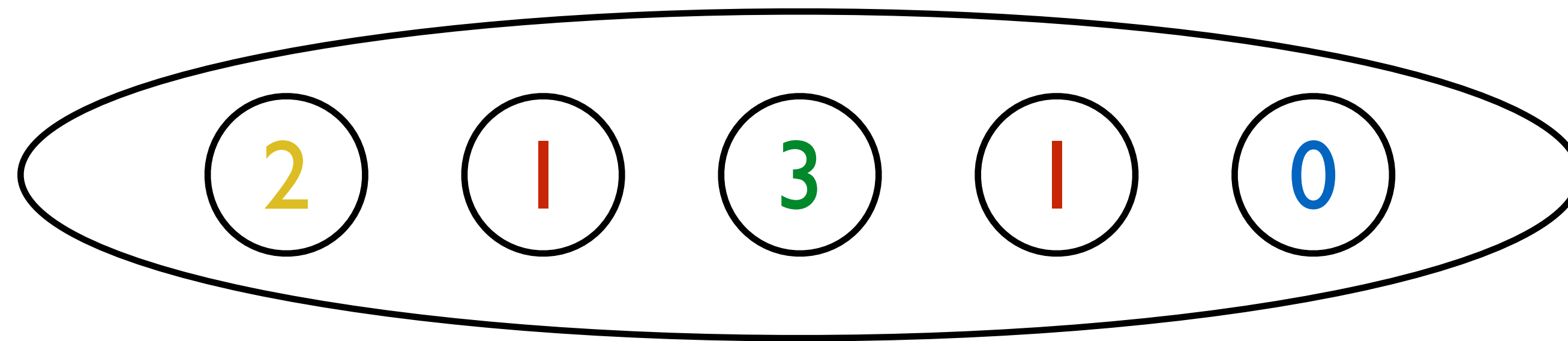
unique maximum

Thm:

[Nakajima-Živný ACM ToCT'22]

- $\text{PCSP}(\text{LO}_k^r, \text{LO}_c^r)$ is NP-hard for all $2 \leq k \leq c$ and $r \geq c - k + 4$.

LO Colouring



unique maximum

Thm:

[Nakajima-Živný ACM ToCT'22]

- $\text{PCSP}(\text{LO}_k^r, \text{LO}_c^r)$ is NP-hard for all $2 \leq k \leq c$ and $r \geq c - k + 4$.
- $\text{PCSP}(\text{LO}_2^3, \text{LO}_\ell^3)$ in P for $\ell = O(\sqrt[3]{n \log \log n / \log n})$.

PCSP(K_3, K_5)

PCSP(K_3, K_5)

Thm: PCSP(K_3, K_5) is NP-hard.

[Barto-Bulín-Krokhin-Opršal JACM'21]

PCSP(K_3, K_5)

Thm: PCSP(K_3, K_5) is NP-hard.

PCSP(K_k, K_c) with $c = k$.

PCSP(K_k, K_c) with $c = k + 2 \lfloor k/3 \rfloor - 1$.

PCSP(K_k, K_c) with $c = 2k - 5$ and $k \geq 6$.

PCSP(K_k, K_c) with $c = 2k - 2$.

PCSP(K_k, K_c) with $c = 2k - 1$.

[Barto-Bulín-Krokhin-Opršal JACM'21]

[Karp CCC'72]

[Khanna-Linial-Safra Comb.'00]

[Garey-Johnson] JACM'76]

[Brakensiek-Guruswami CCC'16]

[Barto-Bulín-Krokhin-Opršal JACM'21]

PCSP(K_3, K_5)

Thm: PCSP(K_3, K_5) is NP-hard.

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PCSP(K_k, K_c) with $c = k$.

PCSP(K_k, K_c) with $c = k + 2 \lfloor k/3 \rfloor - 1$.

PCSP(K_k, K_c) with $c = 2k - 5$ and $k \geq 6$.

PCSP(K_k, K_c) with $c = 2k - 2$.

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[Karp CCC'72]

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PCSP(K_k, K_c) with $c = 2k - 1$.

Thm: PCSP(K_k, K_c) is NP-hard with $c \approx 2^k$ and $k \geq 4$.

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[Krokhin-Opršal-Wrochna-Živný SICOMP'23]

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PCSP(\mathbb{A}, \mathbb{B}) instance \mathbb{I}

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BLP

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$$\sum_{\mathbf{a} \in R^{\mathbb{A}}, a_i = a} \lambda_{\mathbf{x}, R}(\mathbf{a}) = \lambda_{x_i, R_u}(a) \quad a \in A, i \in [\text{ar}(R)]$$

$$\lambda_{\mathbf{x}, R}(\mathbf{a}) \in [0, 1] \quad R \in \sigma, \mathbf{x} \in R^{\mathbb{I}}$$

AIP

PCSP(A, B) instance \mathbb{K}

$$\sum_{\mathbf{a} \in R^A} \lambda_{\mathbf{x}, R}(\mathbf{a}) = 1 \quad R \in \sigma, \mathbf{x} \in R^\perp$$

$$\sum_{\mathbf{a} \in R^A, a_i = a} \lambda_{\mathbf{x}, R}(\mathbf{a}) = \lambda_{x_i, R_u}(a) \quad a \in A, i \in [\text{ar}(R)]$$

$$\lambda_{\mathbf{x}, R}(\mathbf{a}) \in \mathbb{Z} \quad R \in \sigma, \mathbf{x} \in R^\perp$$

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[Brakensiek-Guruswami-Wrochna-Živný SICOMP'20]

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Thm: BA solves all Boolean CSPs. *[Brakensiek-Guruswami-Wrochna-Živný SICOMP'20]*

Problem: Power of BA^k ?

Thm: AGC not solved by BA^k . *[Ciardo-Živný STOC'23]*