

# Minimum violation maps and their applications to cut problems

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Ken-ichi Kawarabayashi, **Chao Xu**

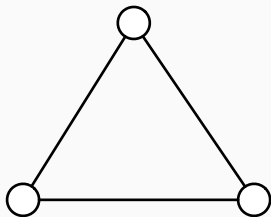
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University of Electronic Science and Technology of China

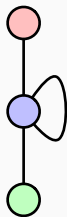
## Map that preserve graph structure

A **map** from  $G = (V, E)$  to  $H = (U, F)$  is a function  $f: V \rightarrow U$ .  $H$  is the **pattern graph**.

A map is a **(graph) homomorphism**, if  $uv \in E$  then  $f(u)f(v) \in F$ .



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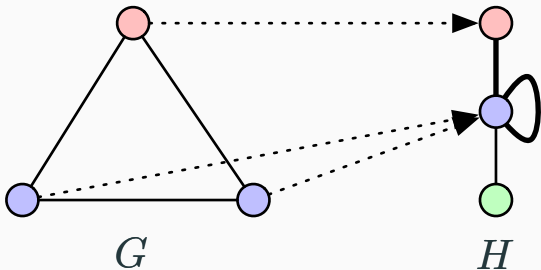


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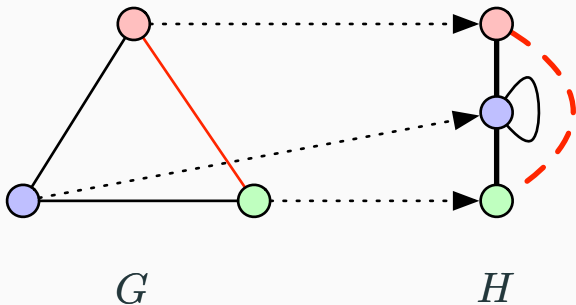
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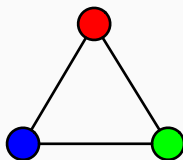
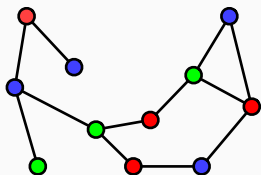


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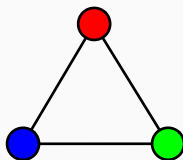
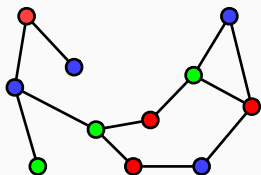
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Graph homomorphism is NP-hard.

## Graph homomorphism can be easy (even with constraints)

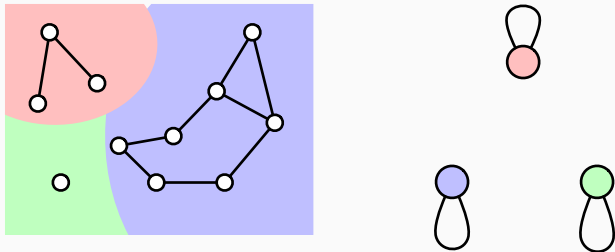
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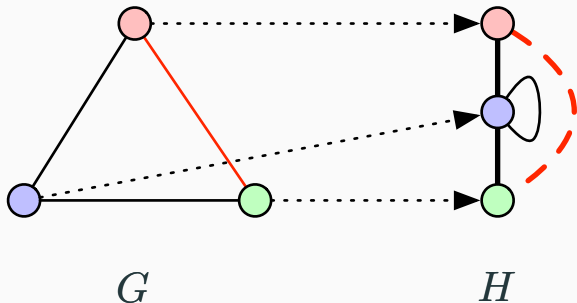
Does the graph have 3 components?



\* additional surjectivity is required.

## Measure how far away from homomorphism

The edge not mapped to an edge is a **violating edge**.

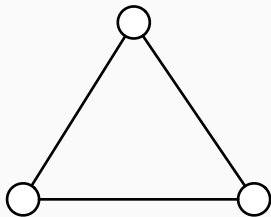


The **violation** of a map is the number of violating edges.

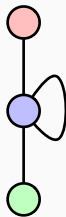
## Surjective Minimum Violation. $SV_{\text{io}}(H)$

Input:  $G = (V, E)$ .

Output: A **surjective** map from  $G$  to  $H$  with minimum violation.



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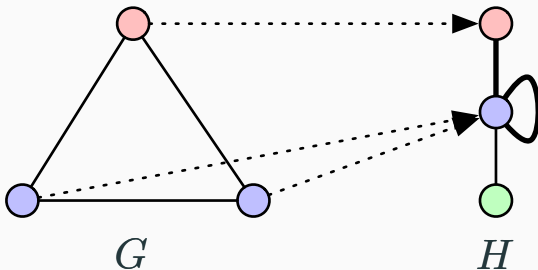


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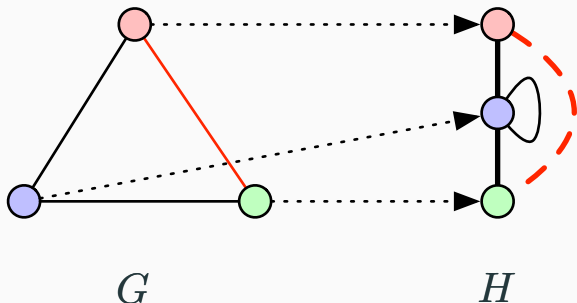
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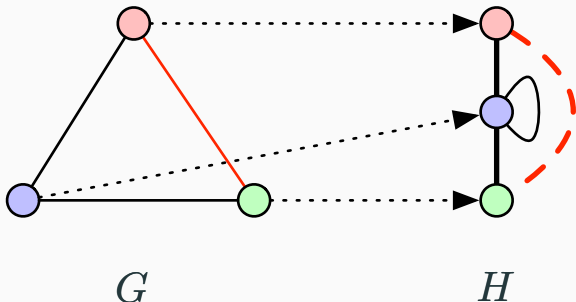
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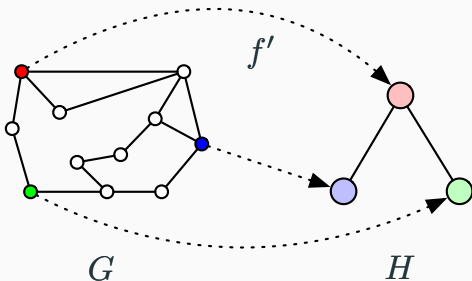
$H$  is **s-tractable** if  $SV_{\text{io}}(H)$  is tractable.

## Retraction minimum violation. $\text{RVio}(H)$

**Input:** graph  $G$  and a bijection  $f' : V' \rightarrow U$  for some  $V' \subseteq V(G)$

**Output:** A map  $f$  from  $G$  to  $H$  such that  $f|_{V'} = f'$  and the violation is minimized.

Vertices in  $V'$  are called **terminals**.

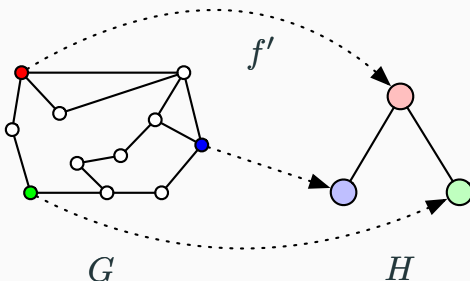


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$H$  is **r-tractable** if  $\text{RVio}(H)$  is tractable.



Goal: classify the s-tractable and r-tractable graphs.

# Why?

For a cut problem, there is usually a pattern graph  $H$ , such that

Fixed-Terminal Min Cut  $\in \mathbf{P}$   $\Leftrightarrow$   $H$  is  $r$ -tractable

Global Min Cut  $\in \mathbf{P}$   $\Leftrightarrow$   $H$  is  $s$ -tractable

Consequence: A unified tool to quickly decide if a cut problem is easy or hard by looking at the pattern graph  $H$ .

## Out Results

- Relating  $r$ -tractability and  $s$ -tractability with various cut problems.
- A **complete classification** of  $r$ -tractable graphs.
- disconnected reflexive  $s$ -tractable graphs are defined by the  $s$ -tractability of its components.
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- A **complete classification** of  $s$ -tractability of **trees**.

## Remarks:

- All graphs after this point are **reflexive**. For simplicity, we do not draw the self-loops.
- We state theorems for graphs, but there are directed graph counterparts.
- Our results hold for weighted graphs too. The violation is the sum of the weights of the violating edges.

- Classification of s-tractable graphs and r-tractable graphs was studied under the name " $G_c$ -cut". [Elem, Hassin & Monnot 13]
- A more general problem called 0-extension problem was studied, but only approximation was considered [Calinescu et. al. 01]

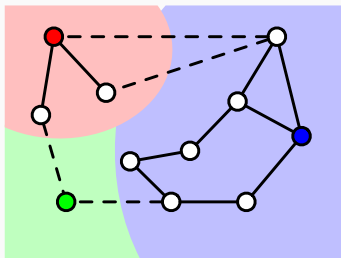
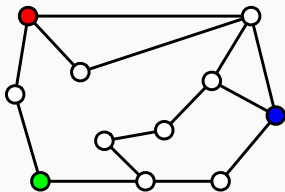
# Modeling cut problems

## $k$ -way cut

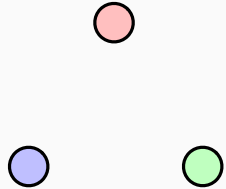
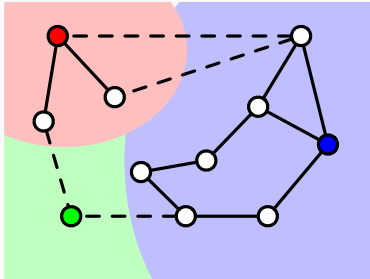
### Problem: Min $k$ -way cut

**Input:**  $G$  and the terminals  $v_1, \dots, v_k \in V(G)$

**Output:** Find a minimum set of edges  $F$ , such that such in  $G - F$ , each pair of terminals cannot reach each other.

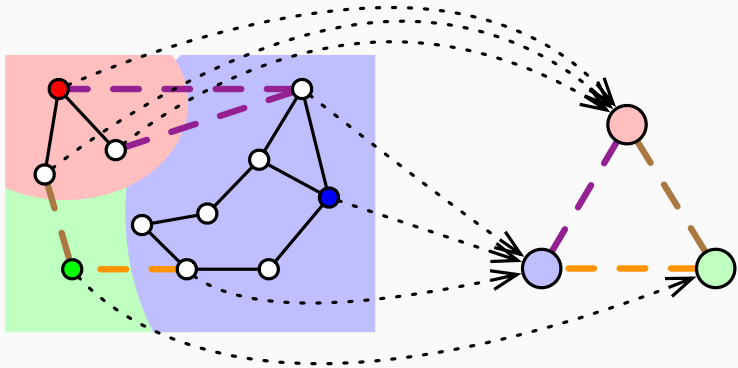


# 3-way cut





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**Problem:** min  $k$ -cut

**Input:**  $G = (V, E)$

**Output:** A minimum set of edges  $F$ , such that  $G - F$  has at least  $k$  components.

## $k$ -way cut and $k$ -cut

$I_k$  is the reflexive graph of  $k$  isolated vertices.

$k$ -way cut is equivalent to **RVio**( $I_k$ ).

$k$ -way cut is NP-hard for  $k \geq 3$ . [Dahlhaus et. al. 94]

$k$ -cut is equivalent to **SVio**( $I_k$ ).

Solvable in polynomial time for every fixed  $k$  [Goldschmidt & Hochbaum 94, Karger & Stein 96].

### Theorem

$I_k$  is  $r$ -tractable if and only if  $k \leq 2$ .  $I_k$  is  $s$ -tractable for all  $k$ .

## $(\ell, k)$ -way-cut

A set of edges  $F$  is a  $(\ell, k)$ -way-cut for a set of terminals  $v_1, \dots, v_k$ , if in  $G - F$ , the pairwise distance of the terminals is at least  $\ell + 1$ .

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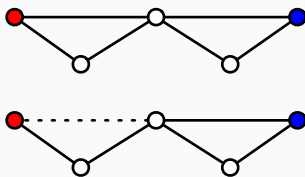
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**Problem:**  $(\ell, k)$ -way-cut

**Input:**  $G$ , terminals  $v_1, \dots, v_k$

**Output:** A minimum cardinality  $(\ell, k)$ -way-cut.



$(2, 2)$ -cut

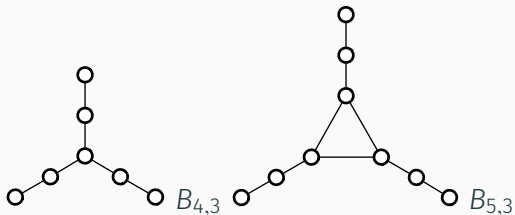
# $(\ell, k)$ -way-cut

Theorem ([Mahjoub & McCormick 00])

$(\ell, 2)$ -way-cut is tractable if and only if  $\ell \leq 3$ .

Theorem

$(\ell, k)$ -way-cut is equivalent to  $RVIO(B_{\ell,k})$ .



## Cut problem in directed graphs

$F$  is a set of edges.  $F$  is a

- $k$ -reach-cut, if in  $G - F$ , there exists a set of  $k$  terminals, such that every vertex can reach at most one of the terminals.



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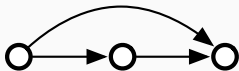
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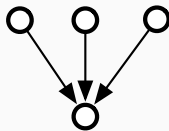
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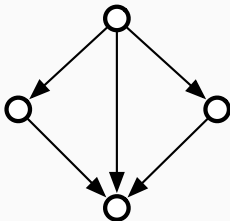
# Cut problem in directed graphs



(a)  $T_3$ , linear-3-cut



(b)  $S_k$ ,  $k = 3$ , 3-reach-cut



(c)  $H_{\text{bicut}}$ , bicut

Previous cut problem is equivalent to  $\text{SVIO}(H)$  for some directed graph  $H$ .

# Classification of $r$ -tractable graphs

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Start with a harder problem.



Let  $G = (V, E)$ ,  $H = (U, F)$ . A cost function  $c : V \times U \rightarrow \mathbb{N}$  assigns cost  $c(v, u)$  to mapping  $v$  to  $u$ .

The **cost** of a map  $f$  from  $G$  to  $H$  is

$$\sum_{v \in V} c(v, f(v))$$

## Minimum cost and violation

**Problem:**  $CVio(H)$

**Input:** Graph  $G$  and a cost function  $c$ .

**Output:** A map  $f$  from  $G$  to  $H$  that minimizes the sum of violation and cost.

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# Minimum cost and violation

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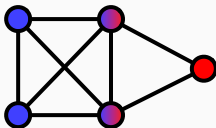
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$H$  is **c-tractable** if  $\text{CVio}(H)$  is tractable.

**Theorem** ([Deineko et.al. 08])

*$H$  is c-tractable if and only if there are two sets  $A$  and  $B$  such that  $A \cup B = V$ , and  $H[A]$  and  $H[B]$  are cliques.*



## But why do we care about $CVio(H)$ ?

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Input to  $\text{CVio}(H)$  is  $G, c$ , where  $c(v', u) = \infty$  if  $v' \in V'$  and  $f(v') \neq u$  and 0 everywhere else.

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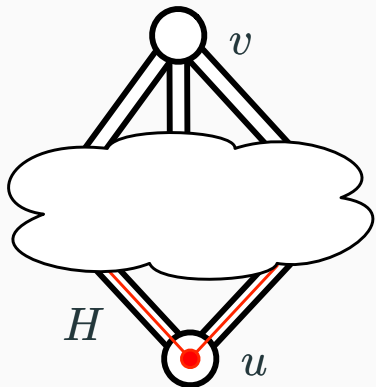
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Hope:  $c$ -tractable and  $r$ -tractable are the same?

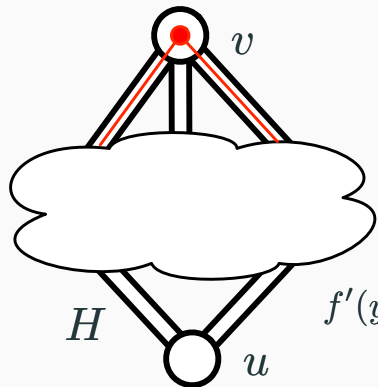
Nope:  $P_4$  is  $r$ -tractable but  $c$ -tractable.

## An observation: moving up



$$N(u) \subseteq N(v)$$
$$f(x) = u$$

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$$N(u) \subseteq N(v)$$

$$f(x) = u$$

$$f'(y) = \begin{cases} f(y) & \text{if } y \neq x \\ v & \text{otherwise} \end{cases}$$

Violation of  $f'$  is at most violation of  $f$ .

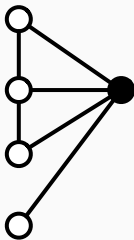
# Superseded vertices

Assume there is a total order  $\prec$  of the vertices in  $H$ .  $u$  is superseded by  $v$ , if

- $N(u) \subsetneq N(v)$ , or
- $N(u) = N(v)$  and  $u \prec v$ .

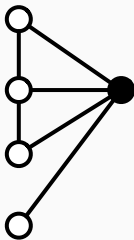
# Apex

A vertex is an **apex** if no vertex supersedes it.



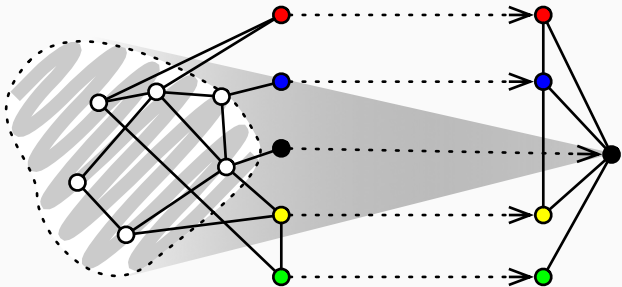
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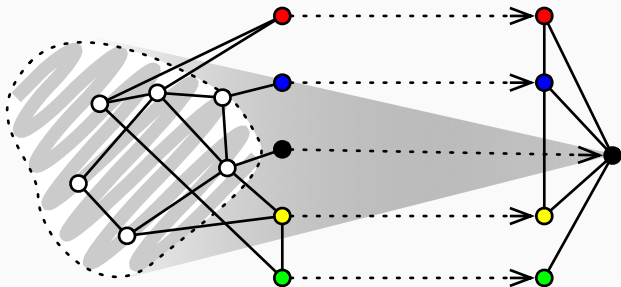
A vertex is an **apex** if no vertex supersedes it.



The **apex subgraph** of  $H$  is  $H[A]$ , where  $A$  is the set of apex vertices.

There exists an optimal solution where the non-fixed vertices are mapped to apex vertices.





A graph with a single vertex apex subgraph is r-tractable.



Theorem ([Elem, Hassin & Monnot 13])

*H is r-tractable if the apex subgraph of H is a complete graph.*

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Complete graphs are c-tractable.

# r-tractability and c-tractability

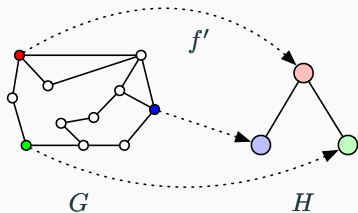
Theorem ([Kawarabayashi & X 20])

$H$  is  $r$ -tractable if the apex subgraph of  $H$  is  $c$ -tractable.

**RVio**( $H$ )

$G = (V, E)$

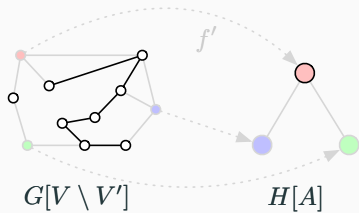
$f' : V' \rightarrow U$



**CVio**( $H[A]$ )

$G[V \setminus V']$

$$c(v, u) = \left| \left\{ vv' \mid \begin{array}{l} v' \in V' \\ vv' \in E \\ uf'(v') \notin F \end{array} \right\} \right|$$



The harder direction requires knowledge from CSP theory.

**Theorem** ([Kawarabayashi & X 20])

*$H$  is  $r$ -tractable if and only if the apex subgraph of  $H$  is  $c$ -tractable.*

The harder direction requires knowledge from CSP theory.

**Theorem** ([Kawarabayashi & X 20])

*$H$  is  $r$ -tractable **if and only if** the apex subgraph of  $H$  is  $c$ -tractable.*

The theorem holds for directed graphs for an appropriate definition of apex.

# Consequence

## A strange problem

**Input:** Graph  $G$  and vertices  $x, y, z$ .

**Output:** A minimum cardinality set of edges  $F$  such that

- $d_{G-F}(x, y), d_{G-F}(y, z) \geq 3,$
- $d_{G-F}(x, z) \geq 4.$

# Consequence

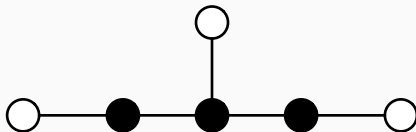
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Reduces to **RVio**( $H$ ), where  $H$  is:



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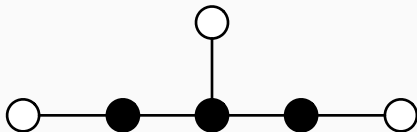
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Reduces to  $\text{RVio}(H)$ , where  $H$  is:



- $(3, 3)$ -way-cut is NP-hard.
- $(4, 2)$ -way-cut is NP-hard.



## s-tractable graphs

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## Previously known

### $\text{SHom}(H)$

**Input:** Graph  $G$ .

**Output:** Decide if there is a surjective homomorphism from  $G$  to  $H$ .

A graph  $H$  is  $s_0$ -tractable if  $\text{SHom}(H)$  is tractable.

- $H$  is  $r$ -tractable then it is  $s$ -tractable.
- $H$  is not  $s_0$ -tractable then it is not  $s$ -tractable.

[Elem, Hassin & Monnot 13]

## Theorem

*A reflexive graph  $H$  is  $s$ -tractable if and only if each of its component is  $s$ -tractable.*

## Theorem

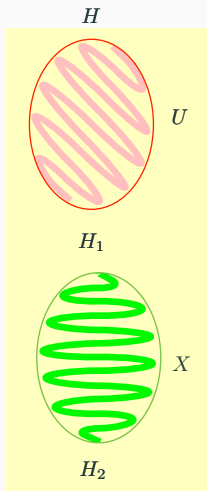
*A reflexive graph  $H$  is  $s$ -tractable if and only if each of its component is  $s$ -tractable.*

We will prove the case when  $H$  has two components.

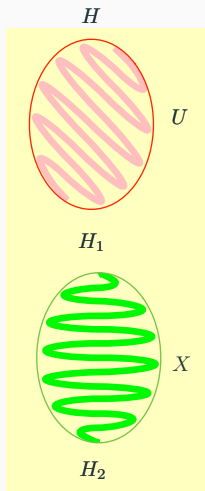
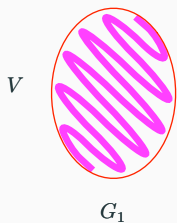
$H$  is composed of components  $H_1$  and  $H_2$ .

$H_1$  is not  $s$ -tractable. We reduce  $\mathbf{SVio}(H_1)$  to  $\mathbf{SVio}(H)$ .

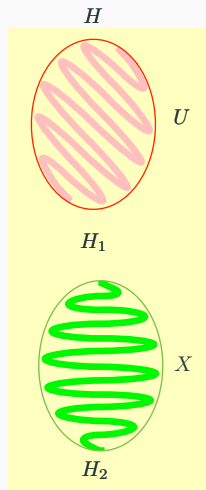
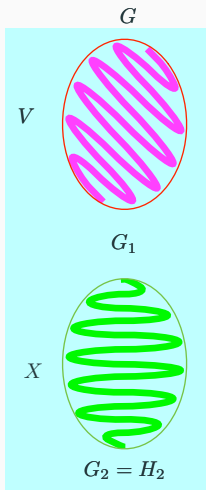
# Hardness



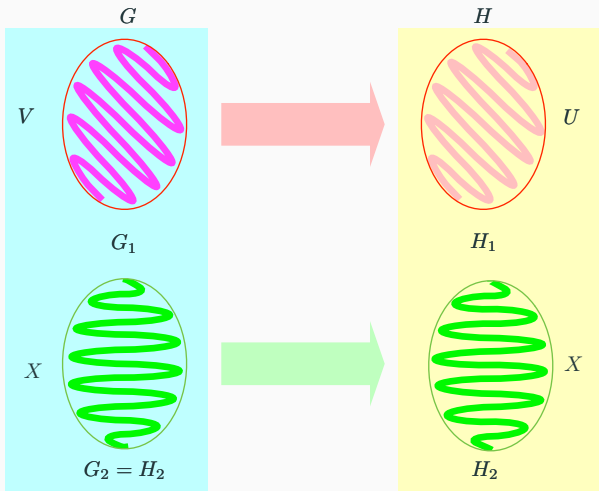
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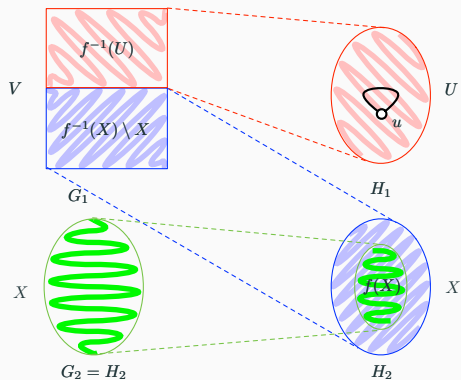


Proof idea: For a minimum surjective map  $f$  from  $G$  to  $H$ , we can find a surjective map  $f'$  such that

- violation of  $f'$  is no larger than violation of  $f$ ,
- $f'(X) = X$ ,
- $f'(V) = U$ .

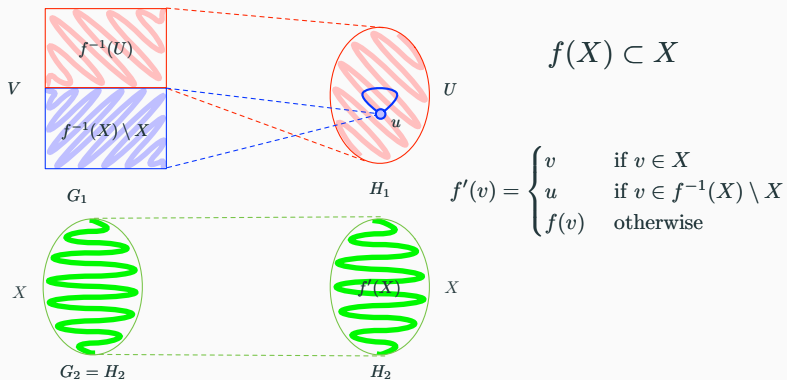
$f'|_V$  is the desired minimum violation map from  $G_1$  to  $H_1$ .

# Hardness

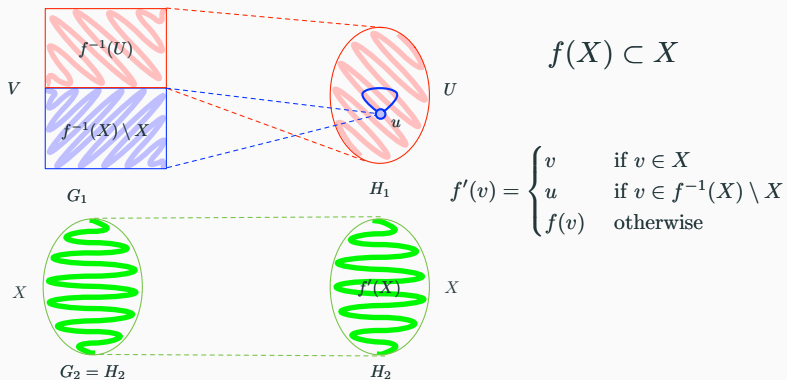


$$f(X) \subset X$$

# Hardness

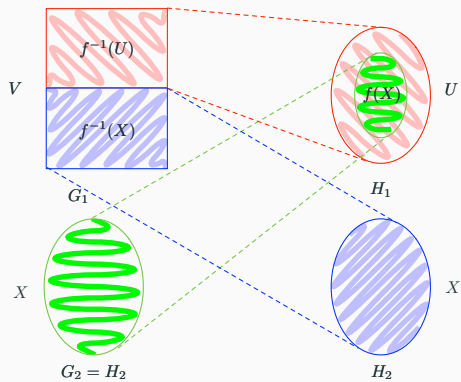


# Hardness



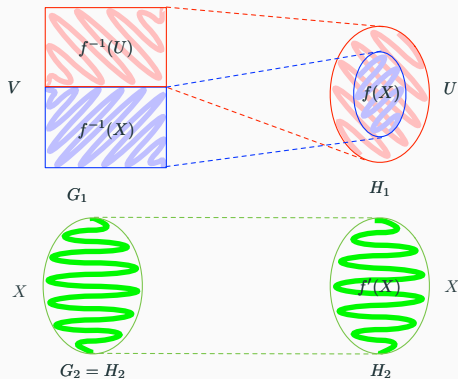
Reflexivity is crucial.

# Hardness



$$f(X) \subset U$$

# Hardness



$$f(X) \subset U$$

$$f'(v) = \begin{cases} v & \text{if } v \in X \\ f(f(v)) & \text{if } v \in f^{-1}(X) \\ f(v) & \text{otherwise} \end{cases}$$

### Theorem

*If the components of a reflexive graph  $H$  are  $s$ -tractable, then  $H$  is  $s$ -tractable.*

## Set up

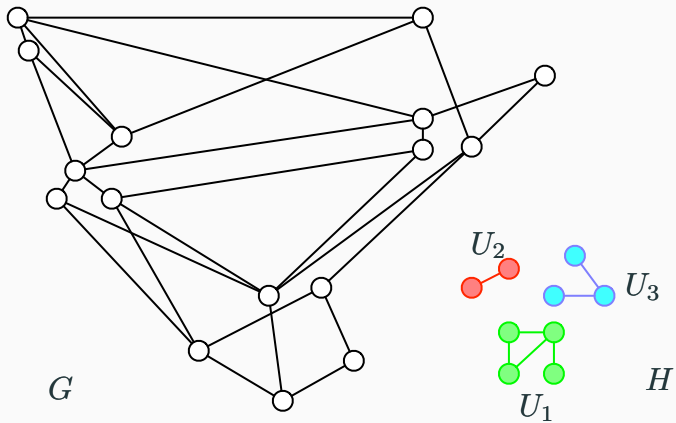
$H$  is a  $k$  vertex graph consist of components  $U_1, \dots, U_\ell$ .

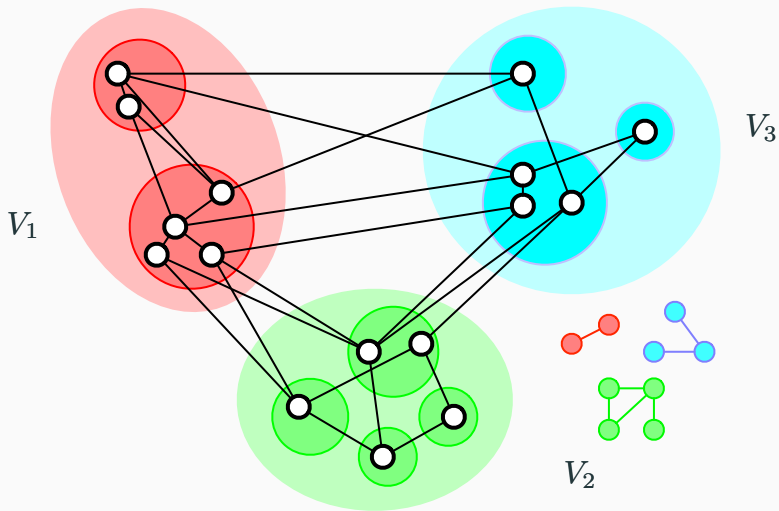
$H[U_i]$  is  $s$ -tractable for all  $i$ .

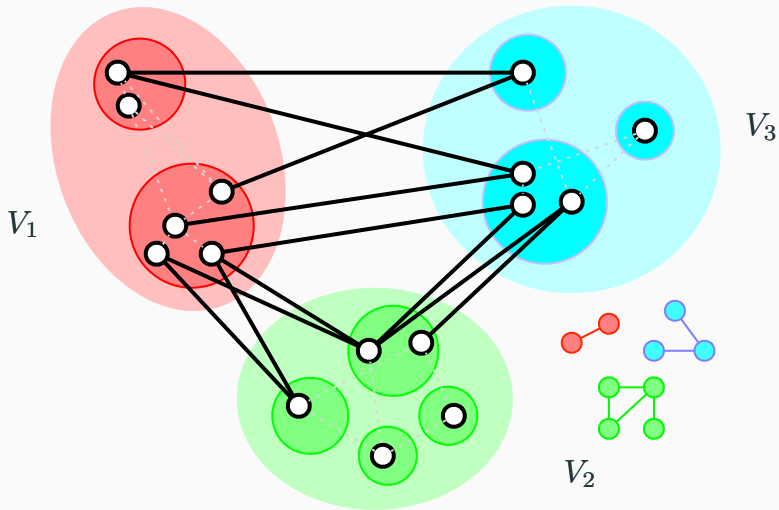
$f$  is the optimal solution of **SVio**( $H$ ) with input graph  $G$ .

$V_i = f^{-1}(U_i)$ .









The set of edges crossing the  $\ell$ -cut  $(V_1, \dots, V_\ell)$  has value at most the value of the min- $k$ -cut of  $G$ .

min- $k$ -cut value  $\geq$  min violation  $\geq$   $\ell$ -cut value.

# Enumerating $\ell$ -cuts with small value

## Theorem

*There exists an algorithm that takes  $n^{O(k)}$  time and produce all  $\ell$ -cuts with value at most the value of a min- $k$ -cut.*

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Through spanning tree packing [Thorup 08; Chekuri, Quanrud, X 20].

Input graph  $G$ .

1. For each  $\ell$ -partition  $(V_1, \dots, V_\ell)$  of value at most min- $k$ -cut
  - 1.1 Solve **SVio**( $H[U_i]$ ) with input  $G[V_i]$ .
  - 1.2 Combine the solutions into a candidate solution.
2. Output the minimum candidate solution.

## Theorem

*A reflexive graph  $H$  is  $s$ -tractable if and only if each of its component is  $s$ -tractable.*



## Theorem

A reflexive tree  $T$  is  $s$ -tractable **if and only if**  $\text{diam}(T) \leq 4$  and for every 3 distinct vertices at least 2 has distance at most 3.

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Proof idea: Hardness

- For trees the distance relations completely determines the existence of homomorphism.
- We design gadgets to force distance relations of fixed vertices.
- Conclude hardness from  $(3, 3)$ -way-cut and  $(4, 2)$ -way-cut.

For the trees not covered by hardness, we see that  $T$  is  $r$ -tractable, therefore  $T$  is  $s$ -tractable.

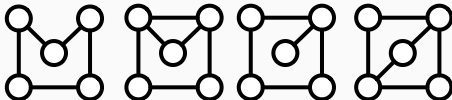
# Open Problems

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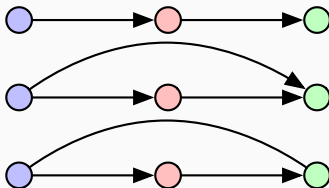
# Classify the s-tractable graphs

All 4 vertex reflexive graphs and 2 vertex digraphs have been characterized.

- Conjectures
  - $H$  has a surjective homomorphism to  $H'$ , and  $H'$  is not s-tractable, then  $H$  is not s-tractable.
- 5 vertex graphs?



- 3 vertex digraphs?



Thank you