



Parameterized Complexity of MinCSP

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based on joint work with
Eun Jung Kim, Stefan Kratsch, and Magnus Wahlström
and many others



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Theorem (Bulatov, Zhuk, 2017)

For every finite D and Γ , the corresponding CSP is either NP-complete and polynomial time solvable.

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- Interesting if CSP(D, Γ) is P-time.
- Trivial $n^{O(k)}$ algorithm.
- Is it FPT parameterized by k ?

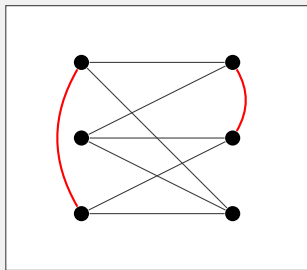
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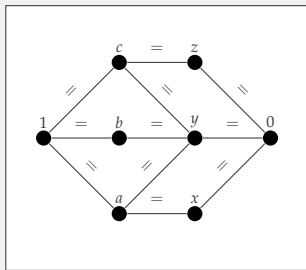


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 - **Undirected Minimum Cut!**

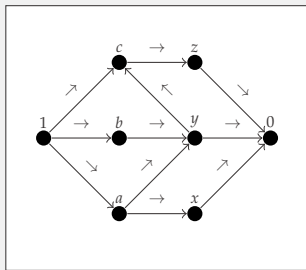


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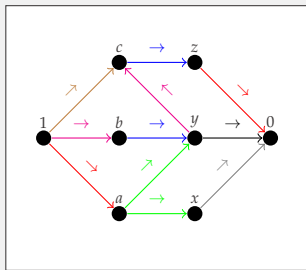


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 - **Bundled Cut with bundles of size 2!**
W[1]-hard (Marx, Razgon 2009)

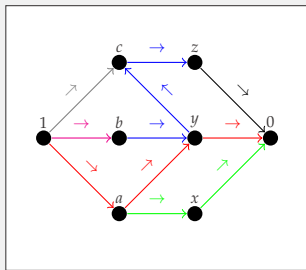


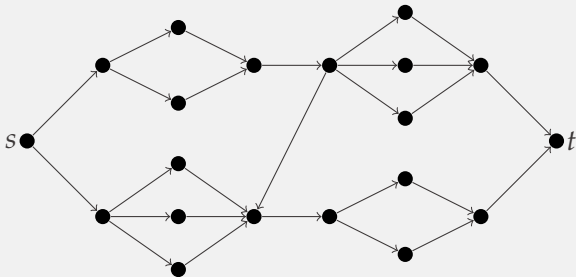
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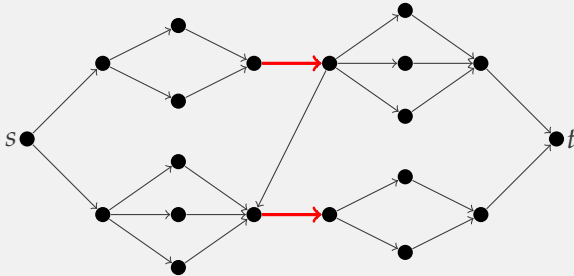
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 - **3-Chain SAT!**
 FPT status was open for some time.



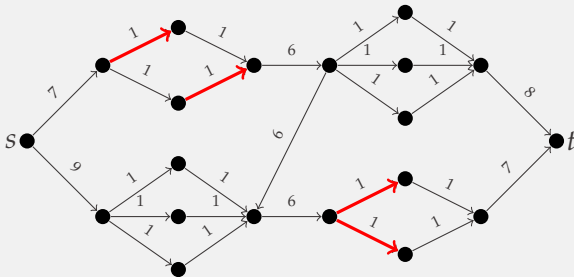


- Minimum (s, t) -cut problem: P-time.

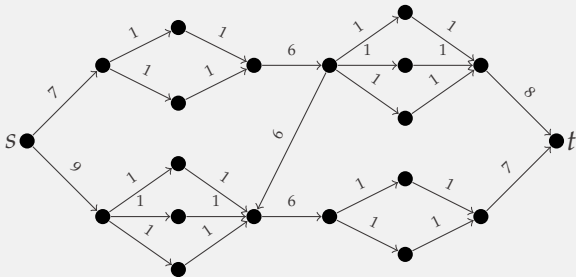


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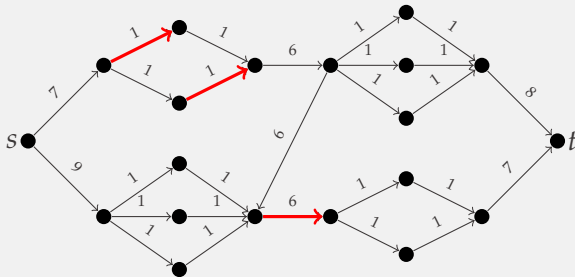
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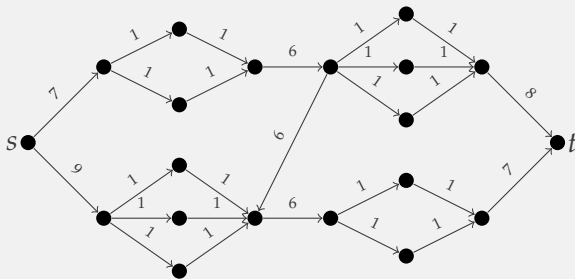
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 - Cardinality $\leq k$. (Figure: $k = 3$.)
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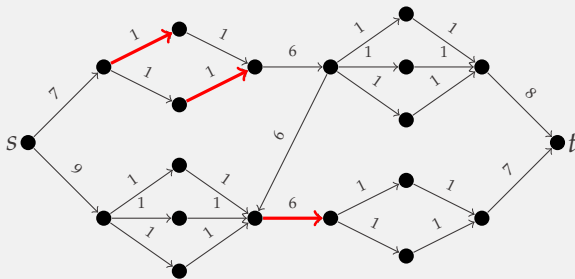
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Bi-objective (s, t) -Cut

Input: digraph G , $s, t \in V(G)$, $\omega : E(G) \rightarrow \mathbb{Z}_+$, $k, W \in \mathbb{Z}$.

Question: is there an (s, t) -cut Z with $|Z| \leq k$ and $\omega(Z) \leq W$.

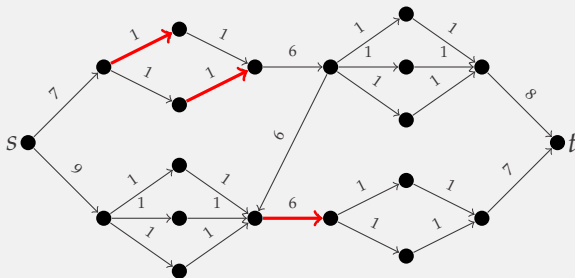


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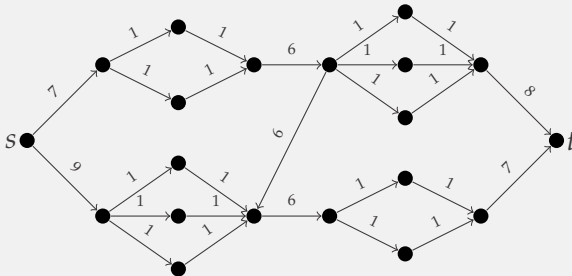
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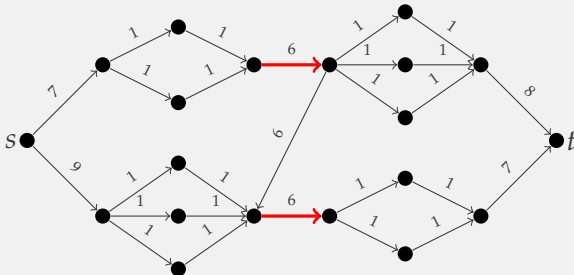
- **Figure:** $k = 3$, $W = 8 \rightarrow \text{YES}$.



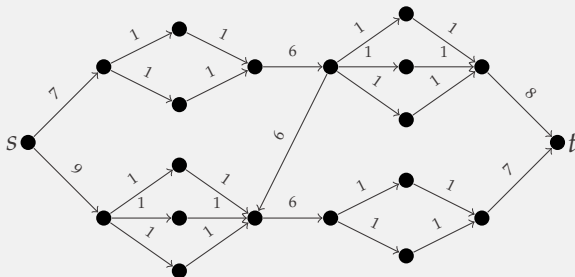
- NP-hard.
- FPT when parameterized by $k + W$.
 - Multi-budgeted important separators.
 - Kratsch, Li, Marx, P., Wahlström, IPEC 2018.
- **Parameterization by k only?**
 - **Undirected: can hammer down with randomized contractions / treewidth reductions.**



- Important observation: P-time for $k = \lambda_G(s, t)$.
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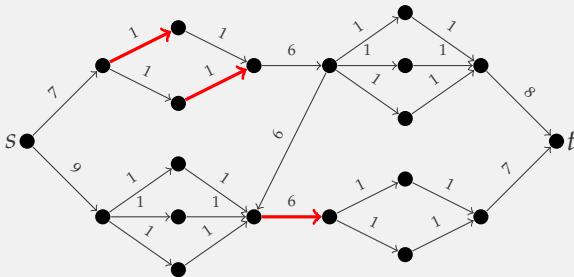


- Important observation: P-time for $k = \lambda_G(s, t)$.
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- **Set**

$$M := 1 + \sum_{e \in E(G)} \omega(e),$$

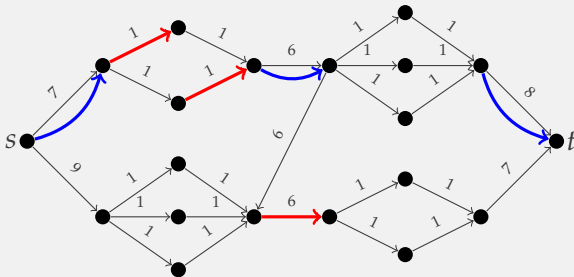
$$\text{cap}(e) := M + \omega(e),$$

and ask for cut of capacity $\leq kM + W$.



Theorem (Kim, Kratsch, P., Wahlström)

There exists a randomized polynomial-time algorithm that, given a digraph G , $s, t \in V(G)$, and $k \in \mathbb{Z}$, outputs $A \subseteq V(G) \times V(G)$ so that for every minimal (s, t) -cut Z of $|Z| \leq k$, with probability $2^{-O(k^4 \log k)}$ the set Z is a minimum (s, t) -cut in $G + A$.



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- Repeat $2^{\mathcal{O}(k^4 \log k)}$ times:
 - Invoke flow-augmentation, obtaining A .
 - Find min-weight solution of cardinality $\lambda_{G+A}(s, t)$ in $G + A$.
- BI-OBJECTIVE (s, t) -CUT is randomized FPT when parameterized by k .

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 - (s, t) -cut whose every arc goes from reachable-from- s to non-reachable-from- s .

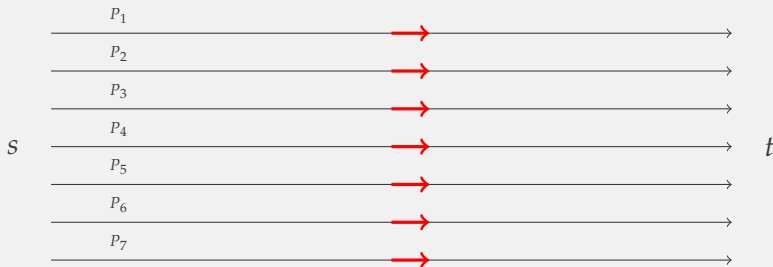
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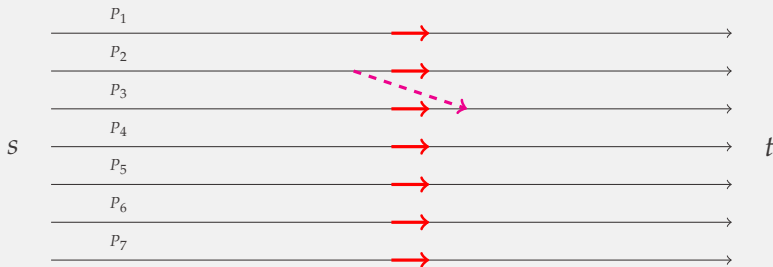
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- **Undirected graphs: $2^{-\mathcal{O}(k \log k)}$ success probability.**

PoV: space of all mincuts

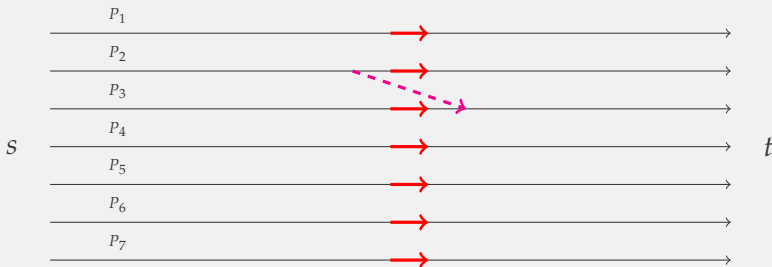




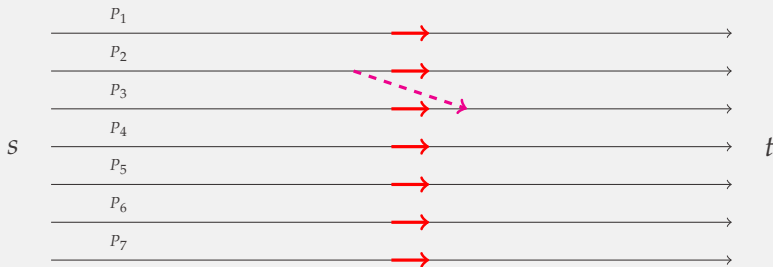
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Path $P_i \sim$ variable x_i where it is cut.



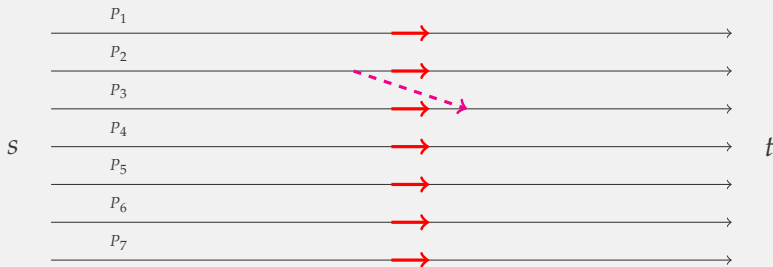
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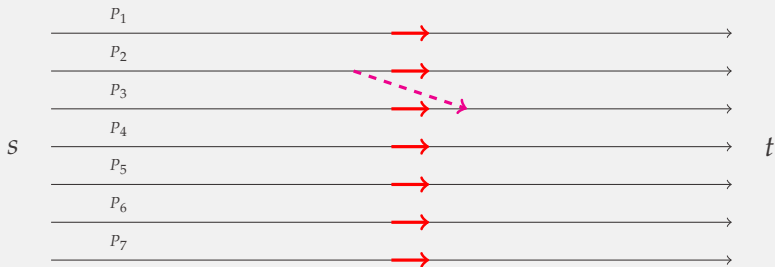
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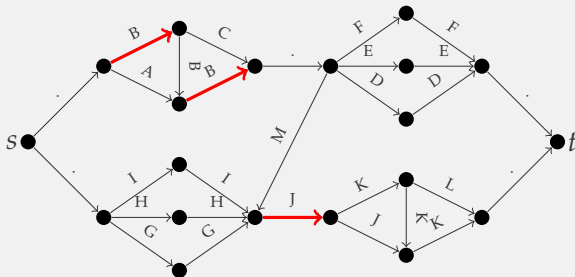
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- Space of all CSP solutions \equiv space of all st -mincuts.
- **Flow-augmentation: cover the space of *minimal* st -cuts of size $\leq k$ with small number of such CSP instances.**

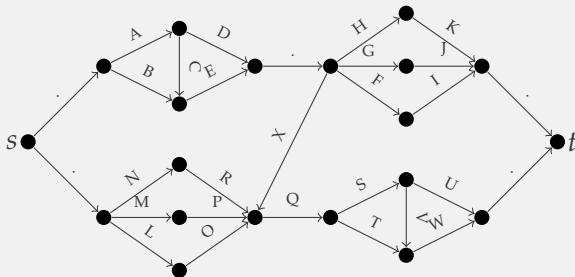


Bundled cut

Input: digraph G , $s, t \in V(G)$, $k \in \mathbb{Z}$, family \mathcal{B} of pairwise disjoint subsets of $E(G)$.

Question: does there exist a minimal (s, t) -cut $Z \subseteq \bigcup \mathcal{B}$ with $|\{B \in \mathcal{B} \mid B \cap Z \neq \emptyset\}| \leq k$.

Figure: solution of cost 2.

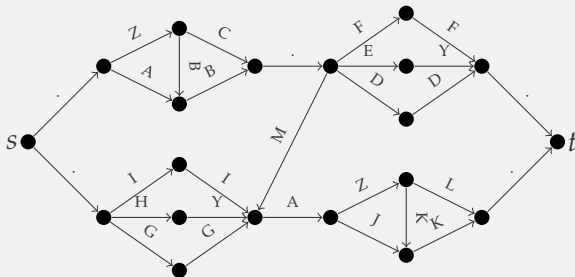


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All $B \in \mathcal{B}$ singletons \longrightarrow minimum (s, t) -cut.

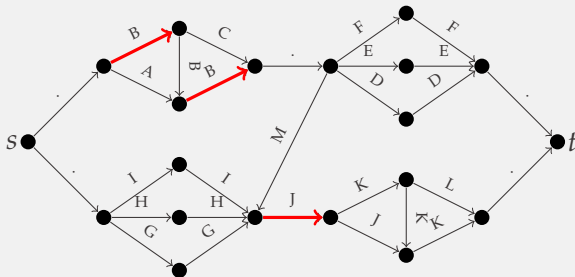


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Every $B \in \mathcal{B}$ of size at most 2 \longrightarrow $W[1]$ -hard with param. k .

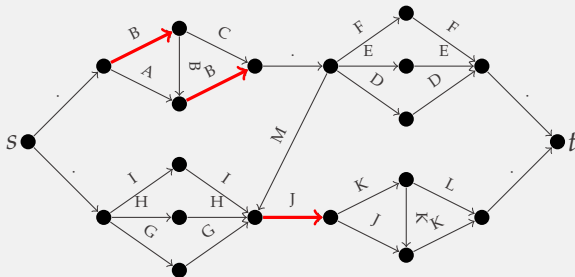


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Every $B \in \mathcal{B}$ is a path of length $\leq \ell \longrightarrow \ell$ -CHAIN SAT.

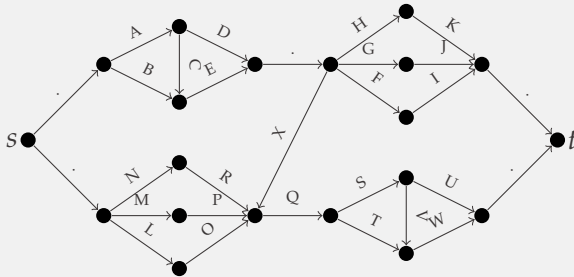


ℓ -Chain SAT

Input: digraph G , $s, t \in V(G)$, $k \in \mathbb{Z}$, family \mathcal{B} of pairwise disjoint subsets of $E(G)$, each being a path of length $\leq \ell$.

Question: does there exist a minimal (s, t) -cut $Z \subseteq \bigcup \mathcal{B}$ with $|\{B \in \mathcal{B} \mid B \cap Z \neq \emptyset\}| \leq k$.

Figure: $\ell = 3$.

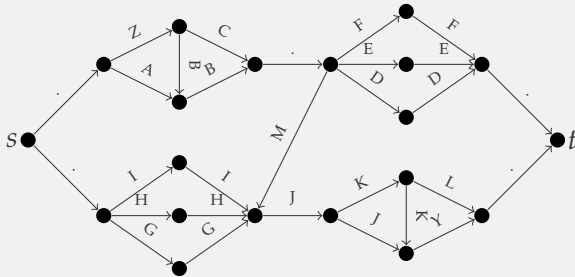


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Case $\ell = 1$: MINIMUM (s, t) -CUT

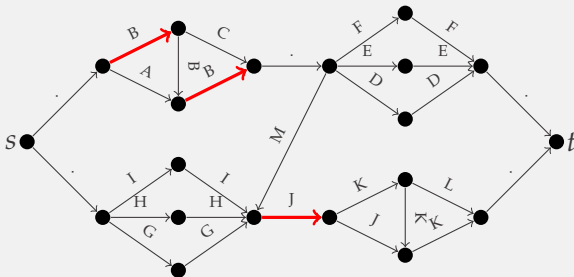


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Case $\ell = 2$: still MINIMUM (s, t) -CUT.

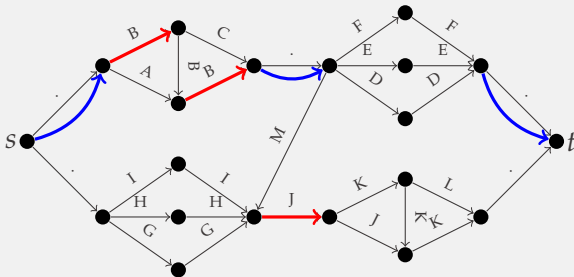


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Case $\ell = 3$: starts to be interesting!



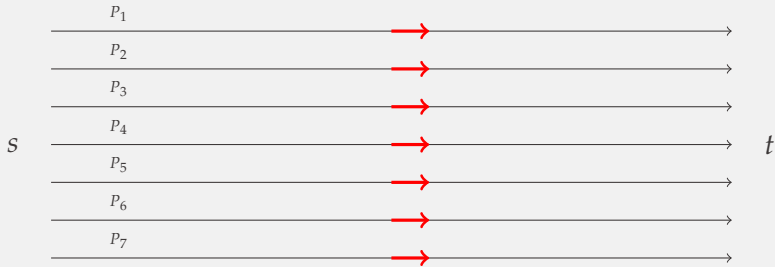
3-Chain SAT

Input: digraph G , $s, t \in V(G)$, $k \in \mathbb{Z}$, family \mathcal{B} of pairwise disjoint subsets of $E(G)$, each being a path of length ≤ 3 .

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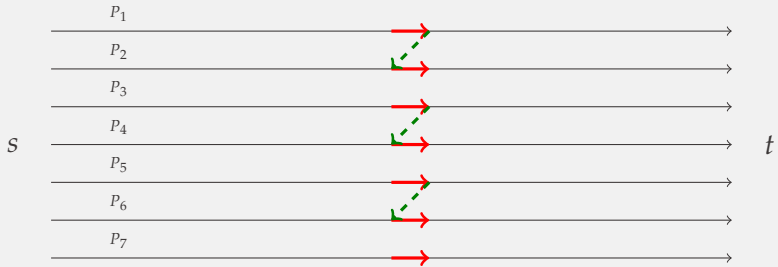
Flow-augmentation: focus on the case Z is a mincut ($|Z| \leq 2k$).



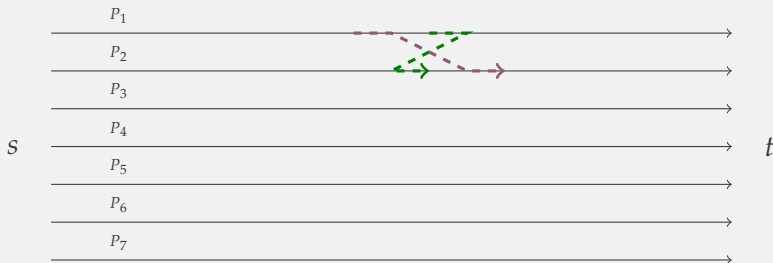




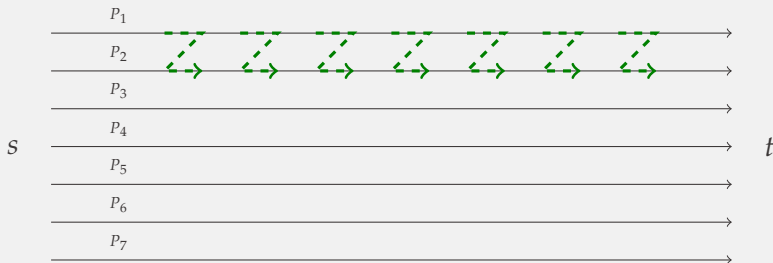
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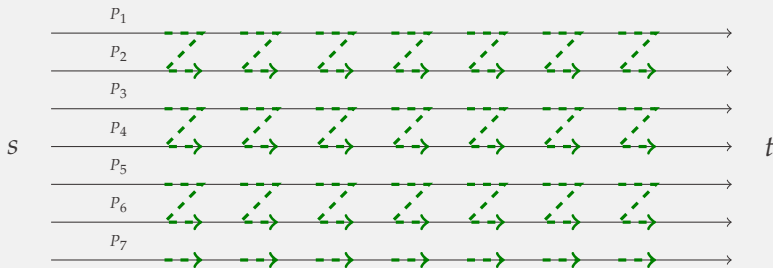
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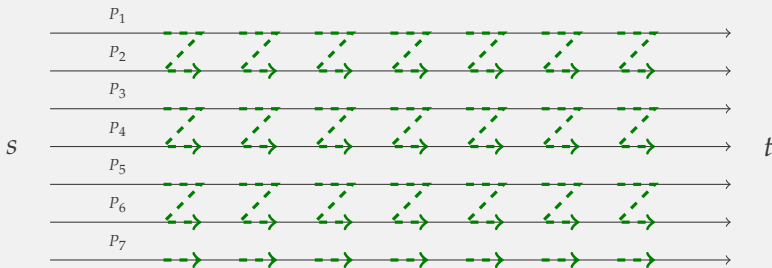
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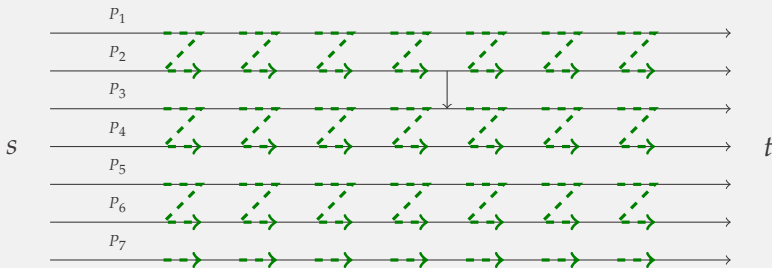
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- **The same (P-time) description as the space of all mincuts.**

Theorem (Kim, Kratsch, P., Wahlström)

CHAIN ℓ -SAT is FPT when param. by k and ℓ .

Works also in the weighted setting.

(Every $B \in \mathcal{B}$ has its weight and we do not want to exceed total weight budget.)

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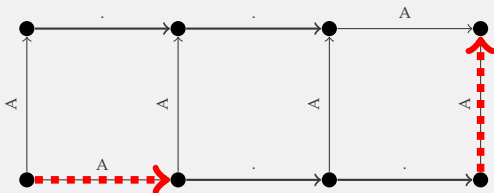
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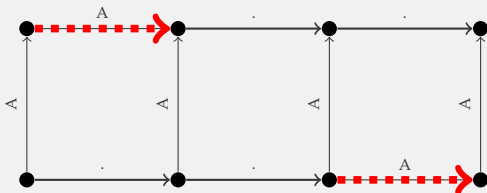


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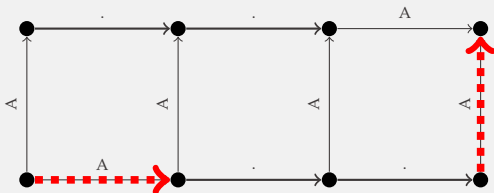


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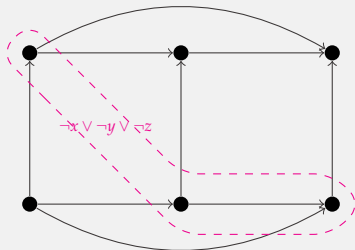
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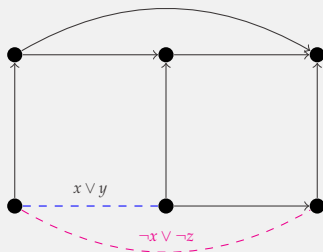
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- **Hardness: Marx-Razgon reduction is the hardness reduction.**



- Constraints defined as an AND of:
 - implications (can use constants 1 and 0);
 - ORs of negated variables.

such that the implication graph is $2K_2$ -free.

Then, MIN SAT is FPT when parameterized by k and max constraint arity (but only unweighted here; weighted is W[1]-hard).



- Constraints defined as an AND of 2-clauses (can use constants 1 and 0).
- Assumption: for every constraint, the graph of 2-clauses is $2K_2$ -free (after deleting 1 and 0).

Then, MIN UNSAT is FPT when parameterized by k and max constraint arity (also in the weighted setting).

MINCSP parameterized complexity classification programme

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Note: requires $\text{CSP}(\Gamma)$ to be P-time.

- **Weighted Directed Feedback Arc Set**
(delete at most k arcs of minimum total weight to get a DAG)

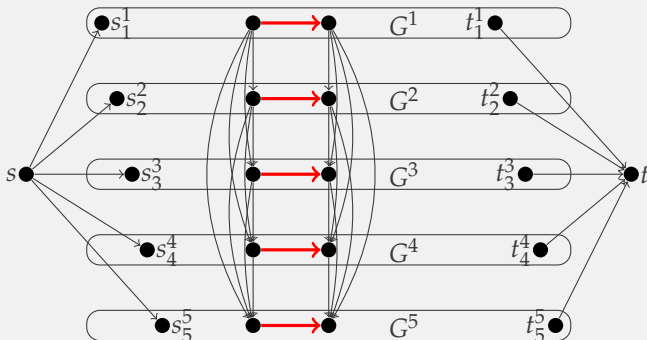
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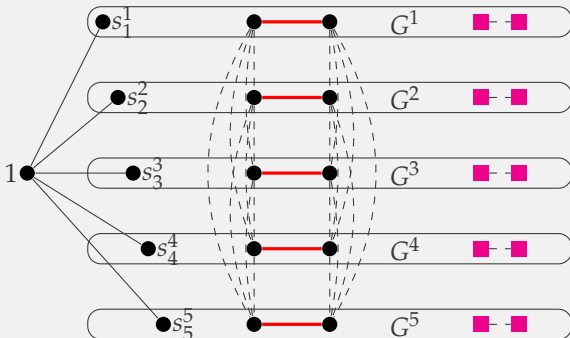
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DIRECTED SUBSET FEEDBACK ARC SET: the input digraph G is equipped with $R \subseteq E(G)$ and the goal is to delete at most k arcs so that no cycle contains an arc of R .

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WEIGHTED UNDIRECTED MULTICUT *can be solved using the algorithm of Tractability Island 2 as a black-box.*



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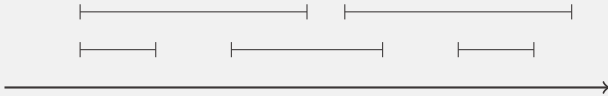
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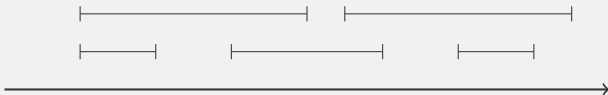
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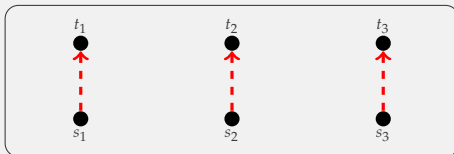
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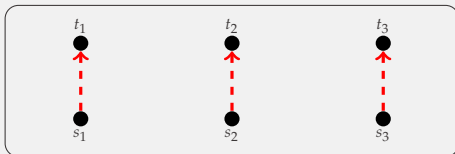
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 - FPT if two variables per equation and \mathbb{K} is an Euclidean domain;
 - W[1]-hard for three variables per equation;
 - W[1]-hard for some commutative rings (e.g., $\mathbb{Z}/6\mathbb{Z}$).

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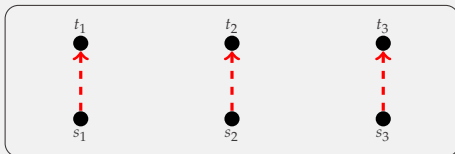


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Theorem (Hatzel, Jaffke, Lima, Masařík, P., Sharma, Sorge, SODA'23)

$\ell = 3$ case is FPT! (Uses twin-width and flow augmentation.)

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