

A new algorithmic framework for enumerating commutable set properties

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Set systems

Definition

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An **independence system** is a set system that is closed under subsets, so that if $A \in \mathcal{F}$ then any $B \subseteq A$ also belongs to \mathcal{F} .

Example: clique

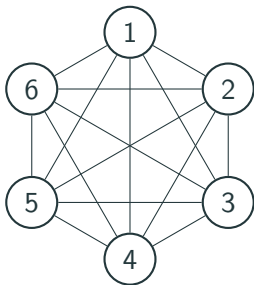
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A **strongly accessible set system** is a set system that satisfies the following property: given $A, B \in \mathcal{F}$, if $A \subsetneq B$ then there is an $a \in B \setminus A$ such that $A \cup \{a\} \in \mathcal{F}$.

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Definition

A **commutable set system** is a strongly accessible set system that satisfies the following property: given $A, B, C, D \in \mathcal{F}$, if $A \subset B \cap C$, $B \cup C \subset D$ then $B \cup C \in \mathcal{F}$.

Example: black-connected cliques

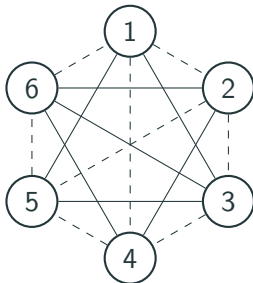
Definition

In a graph with both black and white edges, a **black-connected clique** is a subset of the nodes such that it is a clique and it is connected while considering only black edges.

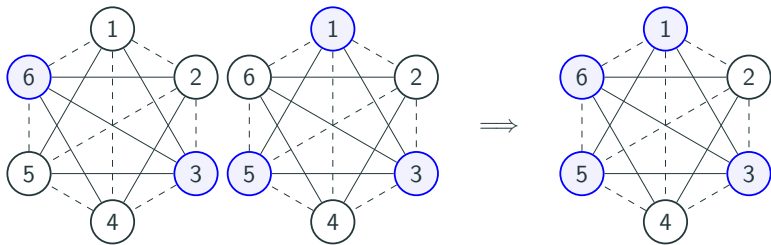
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The “commutable” property for black-connected cliques



Example: k -plex

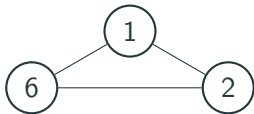
Definition

A k -plex in a graph G is a subset of the nodes such that for any node v there are at most k nodes that do not have an edge with v .

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$$k = 4$$

Example: connected k -plex

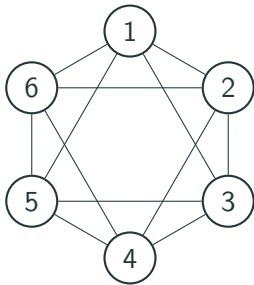
Definition

A **connected k -plex** in a graph G is a subset of the nodes that is both a k -plex and connected.

Example: connected k -plex

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$$k = 2$$

Our goal

The objective of our framework is to **enumerate all the maximal sets** (by inclusion) in a commutable set system.

Reverse search

Definition

Let \mathcal{F} be a strongly accessible set system. We say that *parent* is a **parent function** if it has the following properties:

- It is defined on all the maximal sets in \mathcal{F} , except for some of them we will call the *roots*.

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- There is an order \prec such that $\text{parent}(S) \prec S$ for all the S that are not a *root*.

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If *parent* is a parent function, we define *children*(*S*) for a maximal solution *S* to be the set of all maximal solutions *C* such that $\text{parent}(C) = S$.

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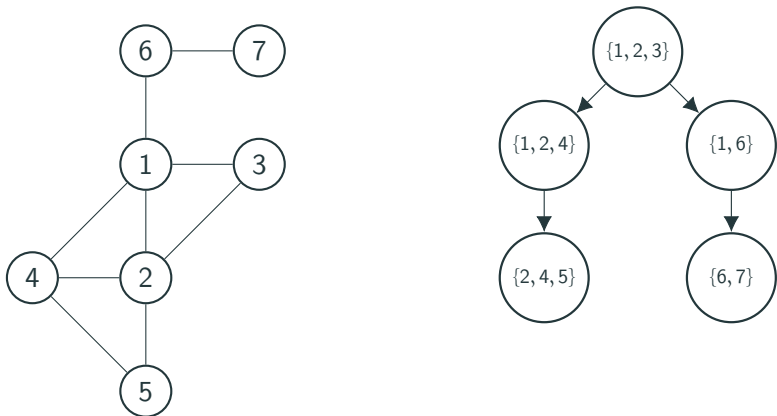
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Theorem

Let G be the directed graph that has the maximal solutions of \mathcal{F} as nodes, and has an outgoing edge from S to any solution in $\text{children}(S)$. Then G is a directed forest rooted in the solutions that are roots.

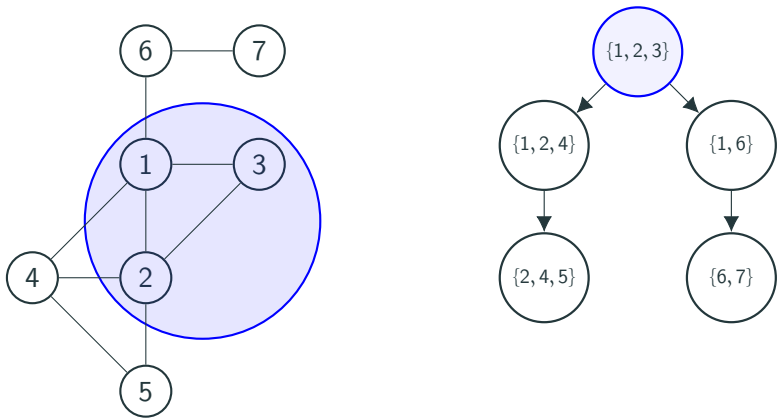
Example

On the right is a possible reverse search graph for the cliques in the graph on the left.



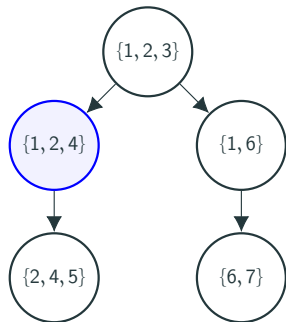
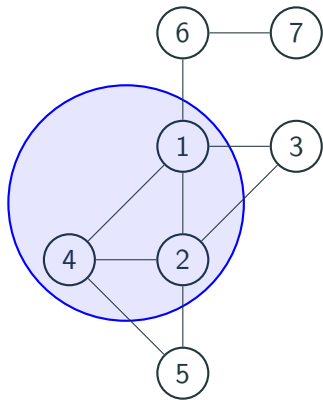
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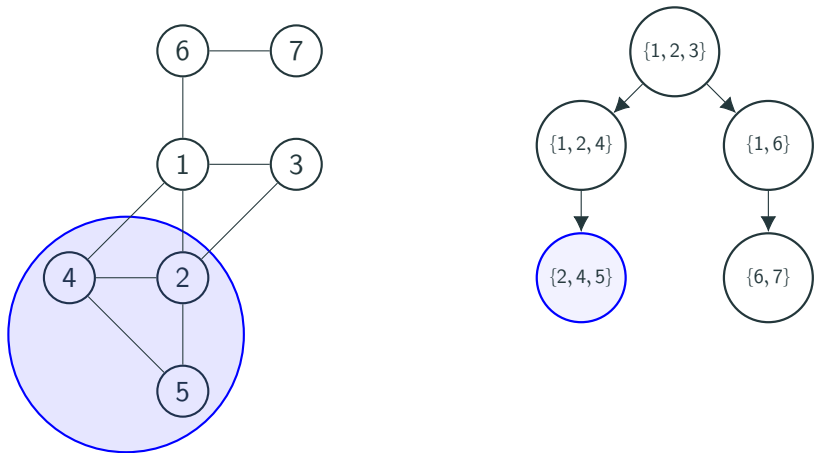
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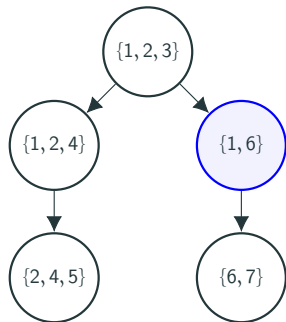
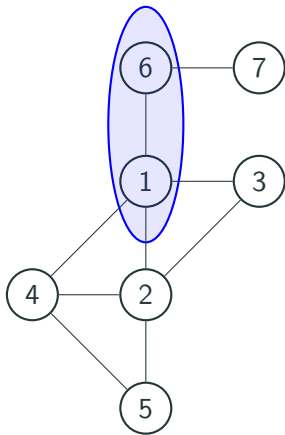
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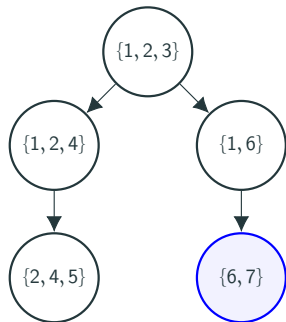
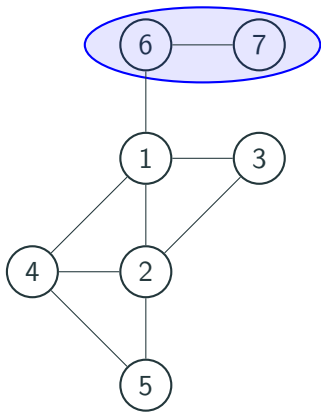
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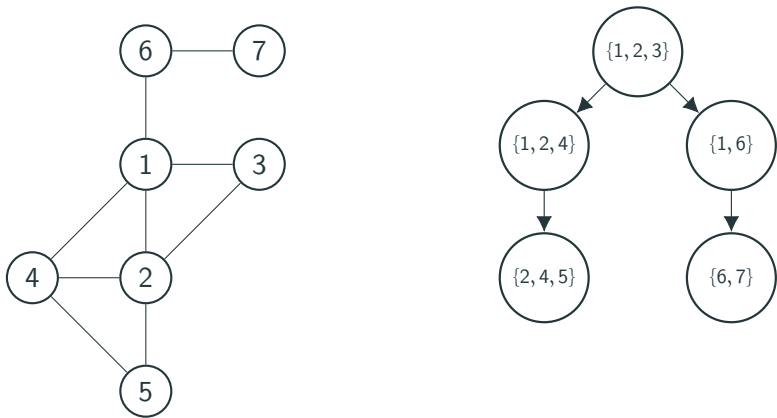
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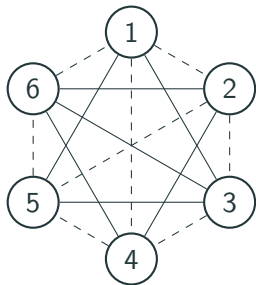


parent and children for commutable
set systems

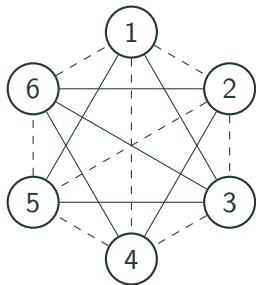
Definition

Given a commutable set system \mathcal{F} and one of its feasible sets S , we say that s is a **seed** of S if $s \in S$ and $\{s\} \in \mathcal{F}$. The **canonical seed** of S , denoted by $seed(S)$, is the smallest possible seed according to the ordering of the elements of E .

Example of these definitions



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Given a commutable set system \mathcal{F} , one of its feasible sets S and a seed s of S , the **level** of an element v with respect to s ($level_s^{\mathcal{F}}(v)$) is defined as follows:

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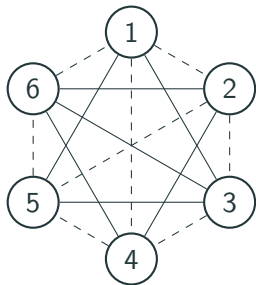
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- if there is no such subset, we say that the level of v is ∞ .

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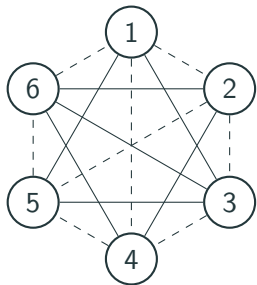


Level 0



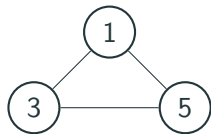
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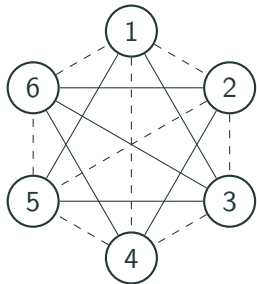
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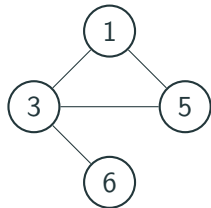
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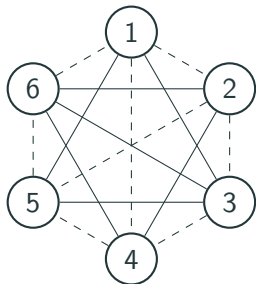
Level 1

Level 2



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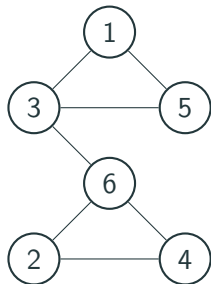


Level 0

Level 1

Level 2

Level 3



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The **level order** \prec between any two solutions P, Q of a commutable set system \mathcal{F} is defined as follows:

- Let $IP = [(level_P(v), v) \forall v \in P]$, the tuple of pairs made by the level of an element and the element itself, sorted in increasing order.

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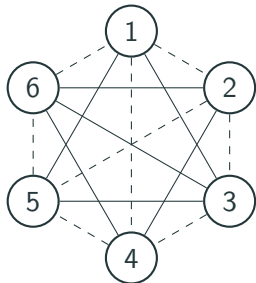
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- Let IQ be defined in the same way.
- We say that $P \prec Q$ if and only if IP is smaller than IQ according to lexicographical order.

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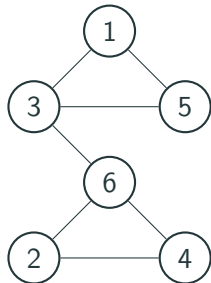


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Level 3



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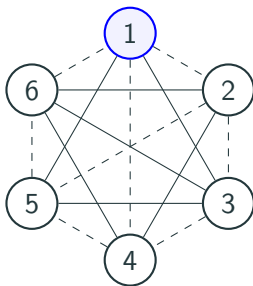
Given a non-maximal solution S of a commutable set system \mathcal{F} , $complete(S)$ is defined as the solution obtained by iteratively adding the smallest-level element to S . In case of ties, the node with the lowest label is chosen.

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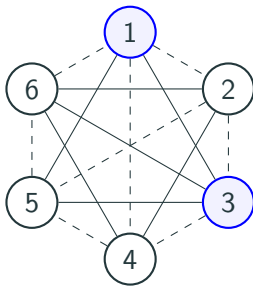


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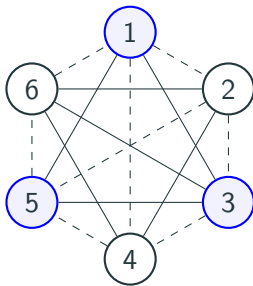


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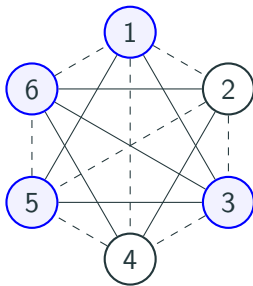
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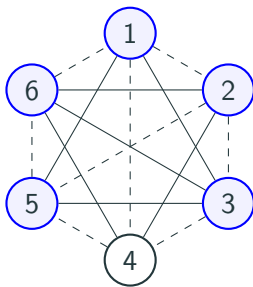
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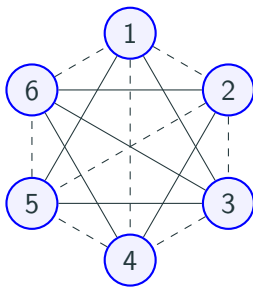
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Definition

Given a maximal solution S , $parent(S)$ is defined as $complete$ of the longest prefix P of S such that $complete(P) \neq S$. This prefix is called $core(S)$ and the next element in S according to level order is called $parind(S)$.

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We can prove that $parent(S) \prec S$.

Definition

Given a strongly accessible set system \mathcal{F} on E , a maximal feasible set S and an element $v \in E \setminus S$, the **restricted problem** $\mathcal{P}(S, v)$ is the problem of enumerating all the maximal elements of the family

$$\mathcal{G}_S^v = \{A \in \mathcal{F} : A \subseteq S \cup \{v\}\}$$

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Theorem

Given a maximal solution C such that $\text{parent}(C) = S$, $\text{core}(C)$ is the prefix ending just before $\text{parind}(C)$ of a solution of $\mathcal{P}(S, \text{parind}(C))$.

Applications

Cliques and black-connected cliques

In both cases, the restricted problem is easy and has at most one solution. Let q be the maximum size of a black-connected clique. Then

Theorem

All the maximal black-connected cliques in a graph G may be enumerated in $O(q^5 \Delta_b^2)$ time per solution, using only $O(q)$ extra memory (other than the memory used to store G).

Lemma

Assuming k to be a constant, if S is a k -plex and v is a node in $V \setminus S$, then there are at most $1 + f(k)|S|^{k-1}$ maximal k -plexes in $S \cup \{v\}$, with $f(k) = (k-1)^{2k}$ for $k > 1$ and $f(1) = 1$. Moreover, they can be computed in $O(kf(k)|S|^k)$ time using only $O(kq)$ memory.

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All the connected k -plexes in a graph G can be enumerated in $O(q^{k+4}\Delta^2 f(k))$ time per solution, using only $O(kq)$ extra memory (other than the memory used to store G).

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- We have studied some families and shown how to apply the framework
- Future work: an experimental evaluation of the algorithms obtained
- Future work: extending the framework to more general families

Any questions?