

On Capacity-filling and Substitutable Choice Rules

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joint with...



Motivation

- ▶ **Choice rules** are essential in the analysis of **resource allocation problems** in which a set of objects, each of which has a certain capacity, is to be allocated among agents.

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- ▶ A well-known example is the **school choice problem** in which each school has a certain number of seats to be allocated among students.
- ▶ Endowing each school with a choice rule is a part of the design process.

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Although the relevant restrictions on choice rules vary across applications, [capacity-filling](#) and [substitutable](#) choice rules remain as the general prominent class of choice rules for many applications.

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We provide a canonical (minimal size) representation of capacity-filling and substitutable choice rules, and explore its implications.

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Capacity-filling & Substitutes

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Substitutes: If an alternative is chosen from a choice set, then it is also chosen from any subset of the choice set that contains the alternative.

$$\text{If } a \in C(S) \text{ and } b \in S, \text{ then } a \in C(S \setminus \{b\}).$$

Substitutes is crucial because...

- ▶ Substitutable choice rules have been a standard tool following the seminal work of [Kelso and Crawford, 1982](#), in broadening the classical matching model with single priority.
- ▶ [Hatfield and Milgrom, 2005](#) show that substitutability guarantees the existence of [stable matchings](#).
- ▶ [Hatfield and Kojima, 2006](#) show that substitutability is [almost necessary](#) for the non-emptiness of the [core](#) in allocations problems
- ▶ Similarly, several classical results of matching literature have been generalized with substitutable choice rules ([Roth and Sotomayor, 1990](#); [Hatfield and Milgrom, 2005](#)).

Ex 1: responsive choice

Let $\succ: a_1 \succ a_2 \cdots \succ a_n$ be a priority ordering over alternatives.

a choice rule C is **responsive** to \succ if for each $S \in \mathcal{A}$, $C(S)$ is obtained by choosing the highest \succ -priority alternatives until the capacity q is reached or no alternative is left.

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For ex., if $q = 3$, then

$$C(a_1, a_5, a_6, a_7) = \{a_1, a_5, a_6\} \ \& \ C(a_1, a_n) = \{a_1, a_n\}$$

Ex 2: lexi(cographic) choice

a **priority profile** $\pi = (\succ_1, \dots, \succ_q)$ is an **ordered list** of q priorities.

a choice rule C is **lexicographic** for π if for each $S \in \mathcal{A}$, $C(S)$ is obtained by

- ▶ choosing the highest \succ_1 -priority alternative in S ,
- ▶ then choosing the highest \succ_2 -priority alternative among the remaining ones, and so on until q .

What do we know from the literature? —

- ▶ capacity-filling and substitutes implies path independence (*Plott, 1973*), which requires

$$\forall S, S' \in \mathcal{A}, C(S \cup S') = C(C(S) \cup C(S'))$$

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- ▶ It follows from *Aizerman and Malishevski, 1981* that each capacity-filling and substitutable choice rule has a collected maximal representation.

collected maximal choice

a choice rule C has a collected maximal representation of size $m \in \mathbb{N}$ if there is a list of m priority orderings $(\succ_1, \dots, \succ_m)$ such that

- i. $\forall S \in \mathcal{A}$ with $|S| \leq q$, $C(S) = S$, and

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- i. $\forall S \in \mathcal{A}$ with $|S| \leq q$, $C(S) = S$, and
- ii. $\forall S \in \mathcal{A}$ with $|S| > q$, $C(S)$ is obtained by collecting the maximizers of the priority orderings in S , i.e.

$$C(S) = \bigcup_{i \in \{1, \dots, m\}} \max(S, \succ_i).$$

Example of C-max rule

Let $A = \{1, 2, 3, 4, 5, 6\}$ and consider the priority profile $(\gamma_\alpha, \gamma_\beta, \gamma_\gamma, \gamma_\delta)$. Let C be the 2-capacity-filling choice rule that is collected maximal of this priority profile.

γ_α	γ_β	γ_γ	γ_δ
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1	1	4	4
4	3	5	1
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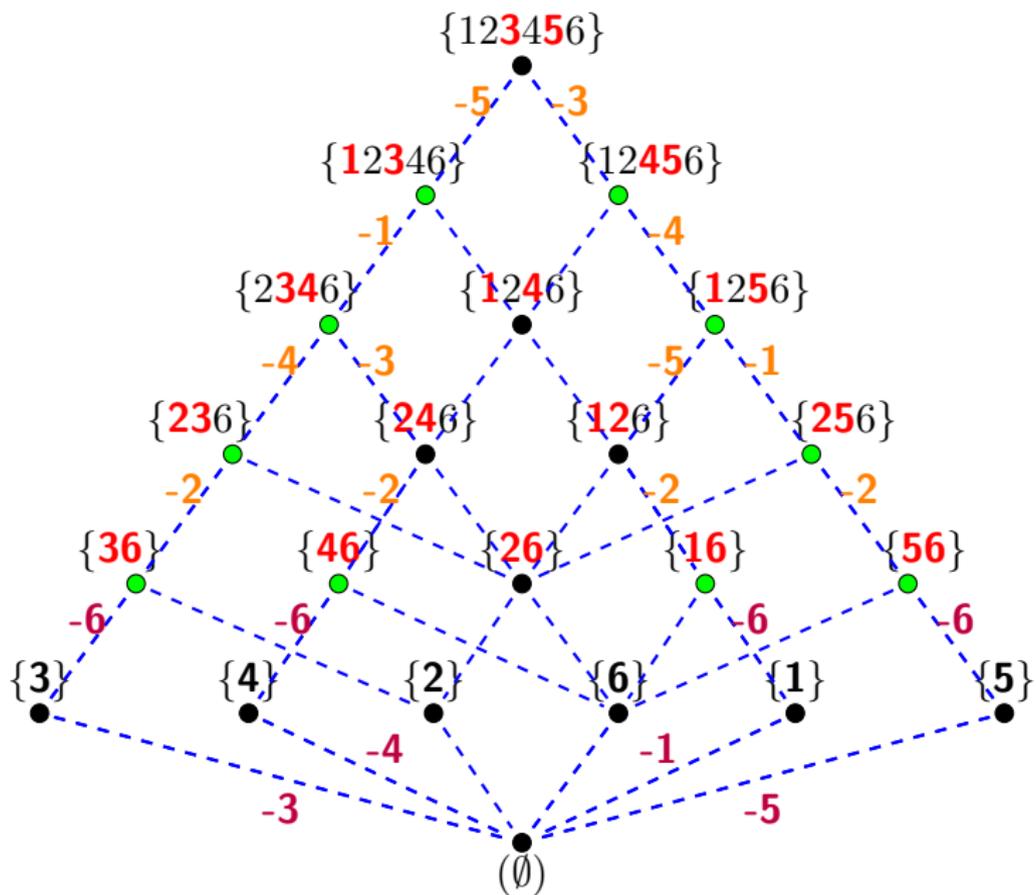
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spoiler!!



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We introduce the concept of a **critical set**, which will be key in finding the minimal number of priorities needed for rendering a collected maximal representation of an capacity-filling and substitutable choice rule.

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Definition: A choice set $S \in \mathcal{A}$ is **critical** for C if $|S| = q$, and there exists $a \notin S$ such that

- ▶ a is chosen from $S \cup \{a\}$,
- ▶ and a is no longer chosen whenever any other element is added to $S \cup \{a\}$.

Ex: critical sets of responsive choice

Suppose C is responsive to $\succ: a_1 \succ a_2 \cdots \succ a_n$

Q: What are the critical sets?

Ex: critical sets of responsive choice

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Q: What are the critical sets?

A: Each choice set with q alternatives, that includes a_n and excludes a_{n-1} .

the minimum size representations

We show that the number of critical sets determines the smallest size collected maximal representation.

Theorem 1: *If a choice rule C satisfies capacity-filling and substitutes, then*

- C has a collected maximal representation of the size equal to the number of its critical sets.*

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We show that the number of critical sets determines the smallest size collected maximal representation.

Theorem 1: *If a choice rule C satisfies capacity-filling and substitutes, then*

- i. C has a collected maximal representation of the size equal to the number of its critical sets.*
- ii. C fails to have a collected maximal representation of any size smaller than the number of its critical sets.*

Proof

C-max representation of responsive rules

Proposition *The upper bound on the number of critical sets is $\binom{n-2}{q-1}$ and it is achieved by responsive choice rules.*

Put differently, responsive choice rules render a collected maximal representation of the largest size among all q -capacity-filling choice rules that satisfy substitutes.

collected q -maximal choice

a choice rule C has a **collected q -maximal representation** if there is a list of q priority orderings $(\succ_1, \dots, \succ_q)$ such that

- i. $\forall S \in \mathcal{A}$ with $|S| \leq q$, $C(S) = S$, and
- ii. $\forall S \in \mathcal{A}$ with $|S| > q$, $C(S)$ is obtained by collecting the maximizers of the priority orderings in S , i.e.

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- ▶ for each q -capacity-filling choice rule, the minimum number of priorities that can render a collected maximal representation is at least q .

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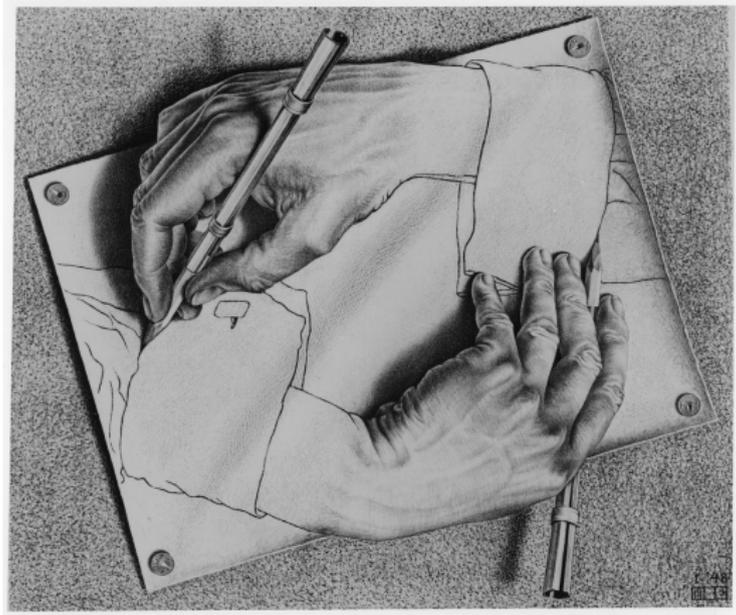
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- ▶ schools typically come up with *slot specific priorities* and apply these sequentially
- ▶ If a school with q -many slots chooses according to a collected q -maximal choice rule, then
 - i. school can transparently reveal the order to be maximized,
 - ii. choice is immune to, rather debatable, order based affirmative action effects.

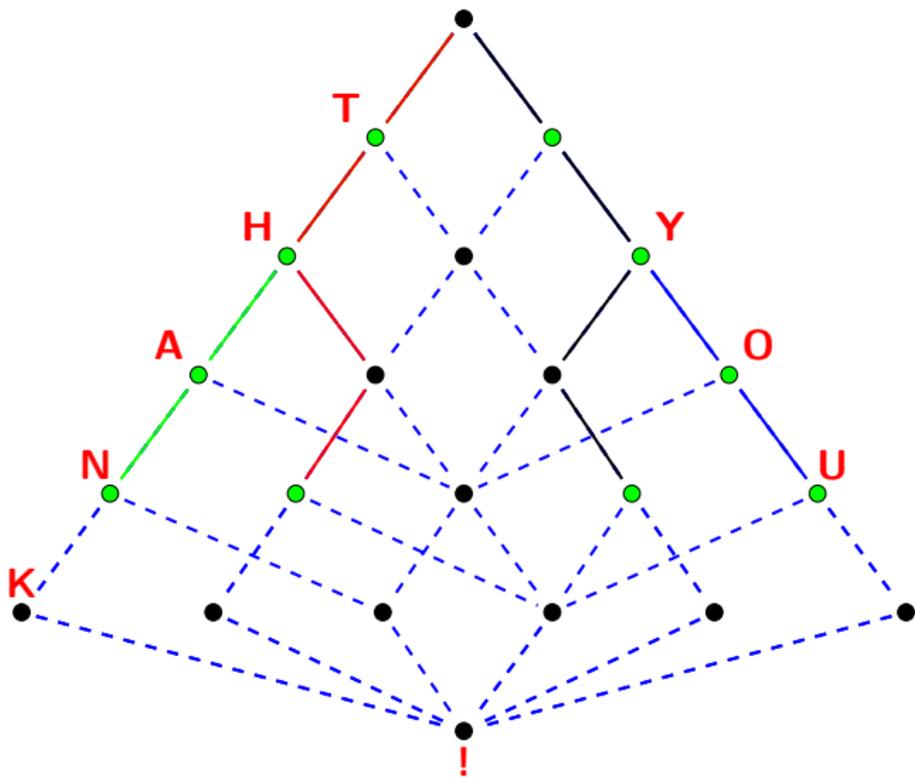
an impossibility

Theorem 2: *For each capacity constraint q and universal set of alternatives with n members, if $q > 3$ and $n > q + 2$, then there is no capacity-filling choice rule C that is collected q -maximal.*

└── conclusion ──

conclusion





Sketch of Theorem 1's proof

- ▶ Lattice rep. of a choice rule
- ▶ Definitions
- ▶ Main observations
- ▶ Construction of the priorities

Lattice rep. of a choice rule

Example

Let $A = \{1, 2, 3, 4, 5\}$ and C be the 2-capacity-filling choice rule that is collected maximal of $(\succ_{\alpha}, \succ_{\beta})$

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lattice rep. of the ex. —

{12345}



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{12**3**45}



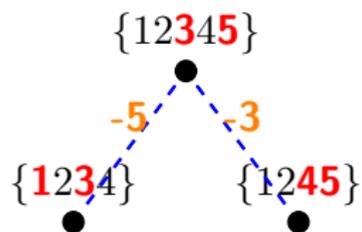
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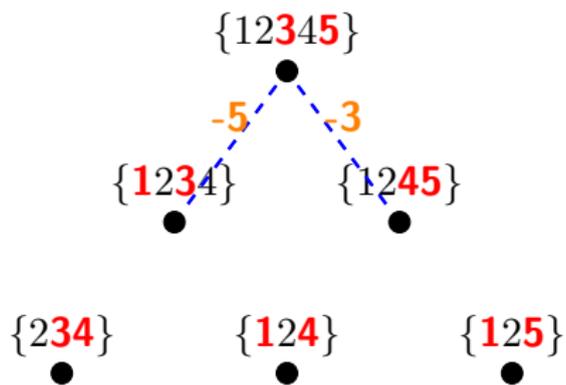
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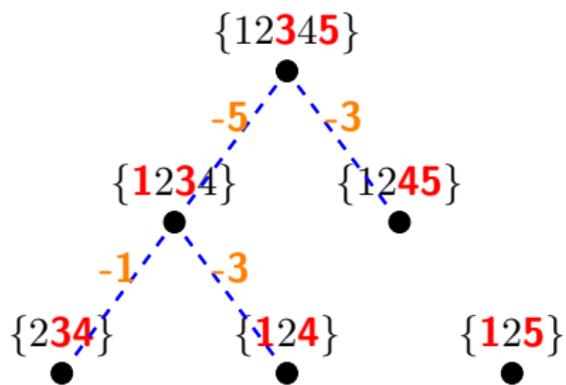
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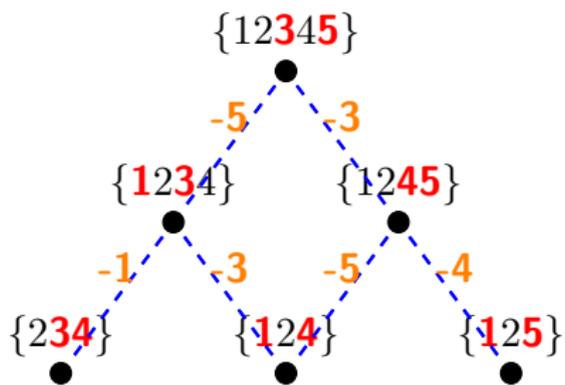
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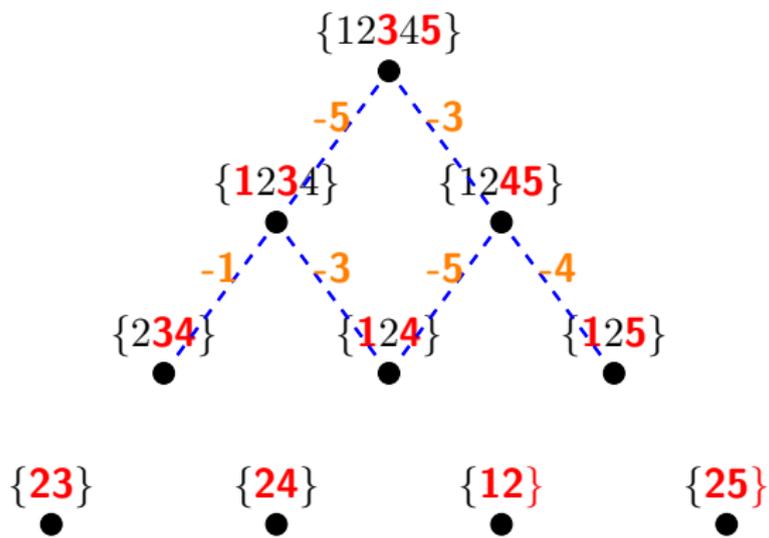
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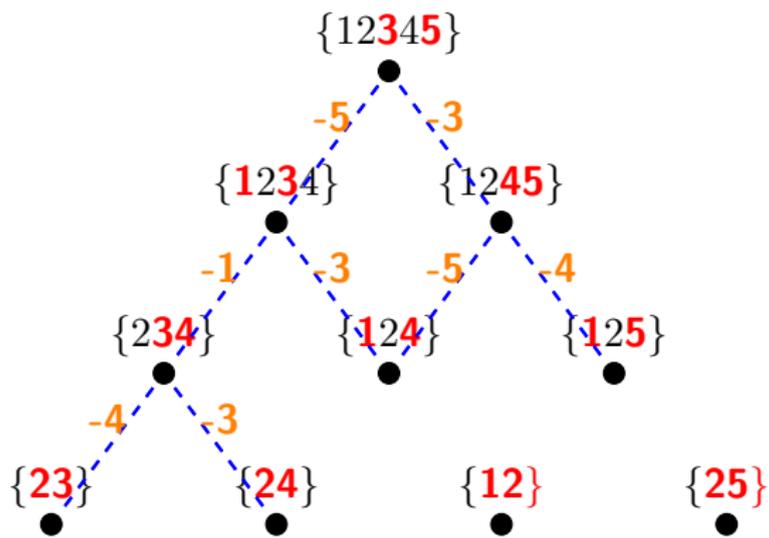
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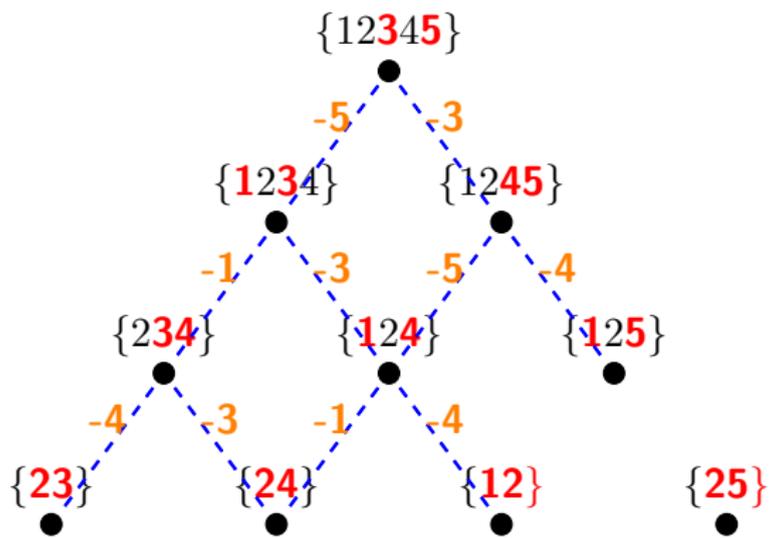
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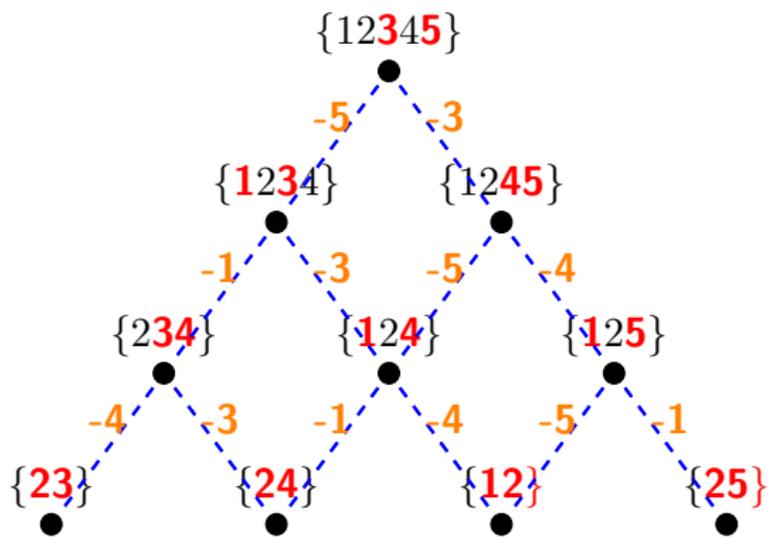
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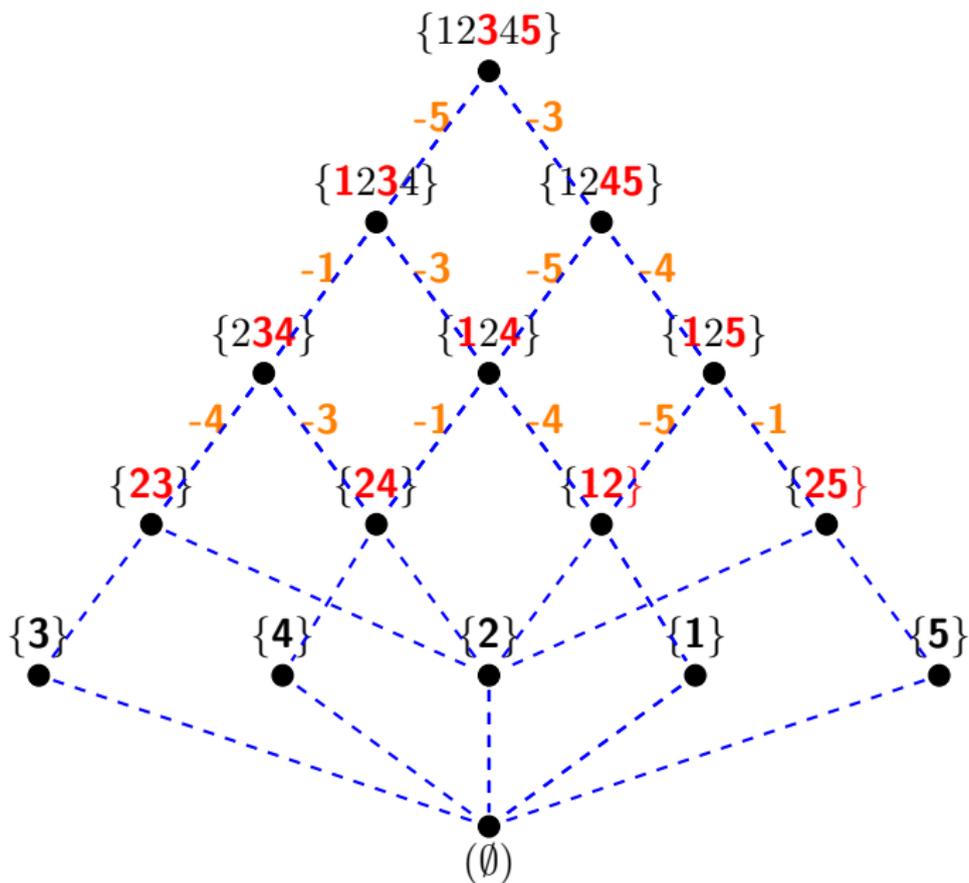
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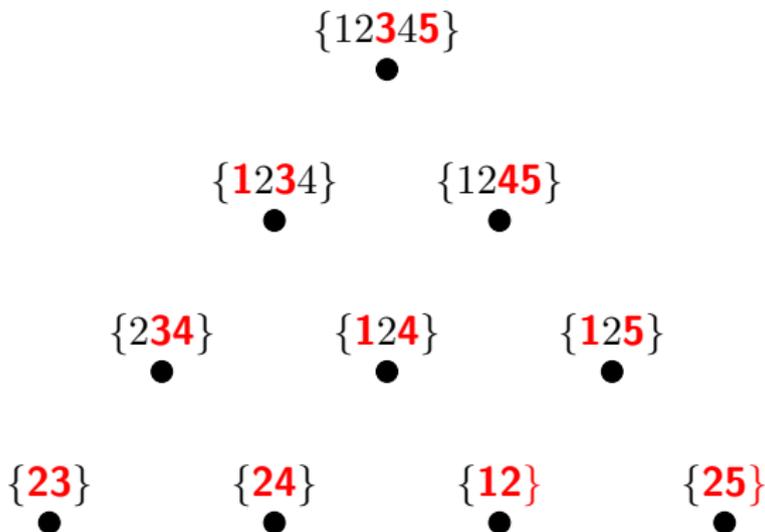


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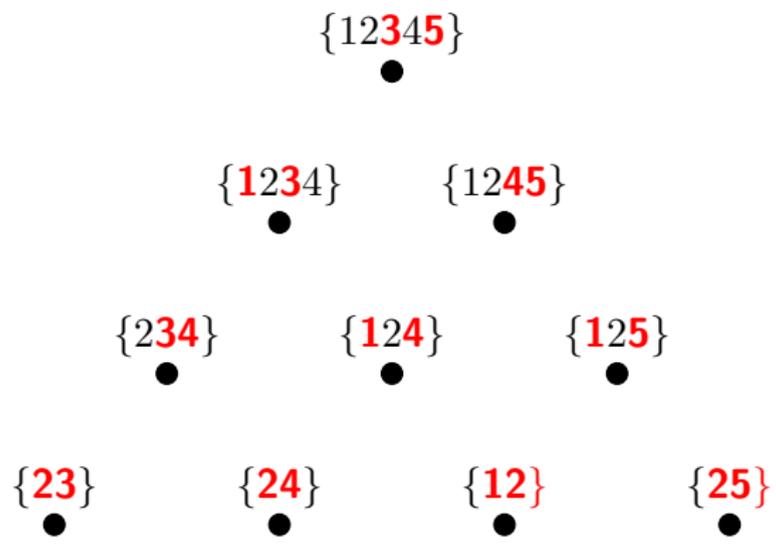
Definitions

maximal choice sets

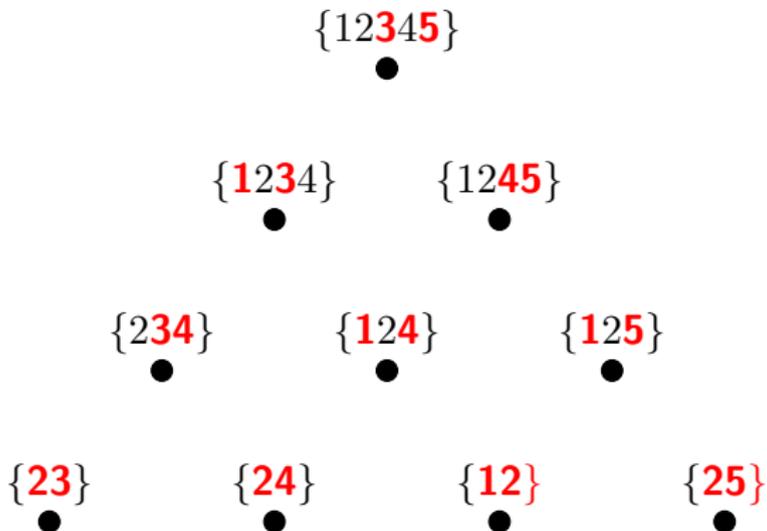


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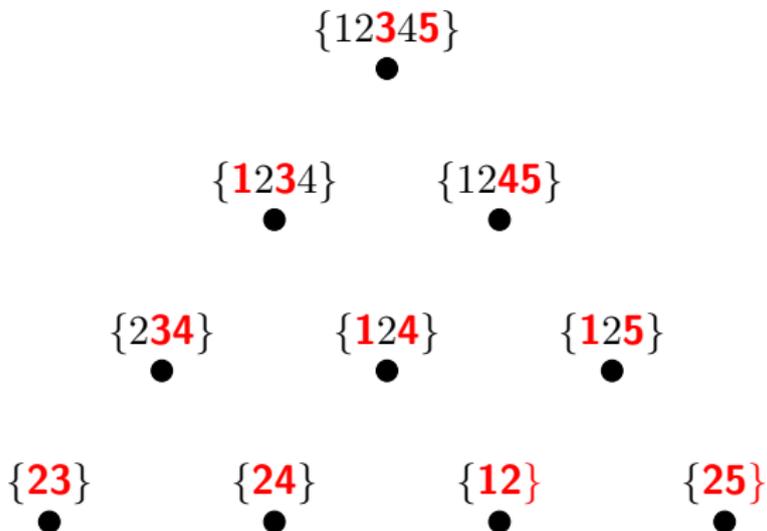


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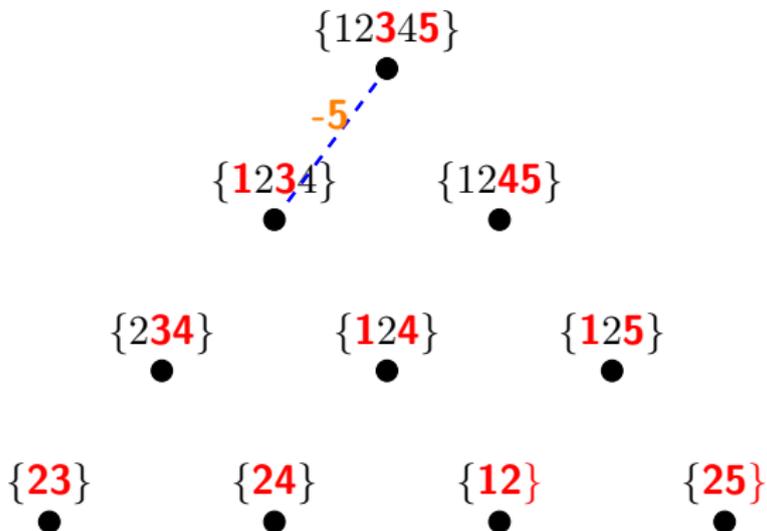
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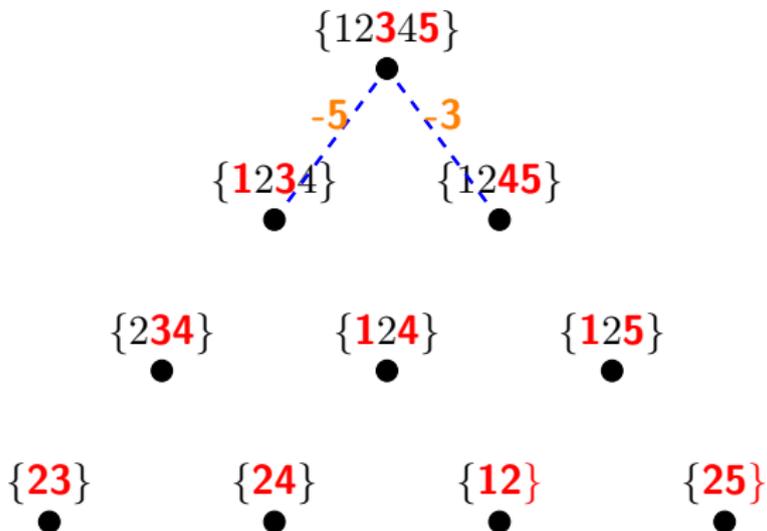
$\forall S, S' \in \mathcal{M}$, S is a **parent** of S' , denoted by $S \rightarrow S'$,
if $\exists a \in C(S)$ s.t. $S' = S \setminus \{a\}$.

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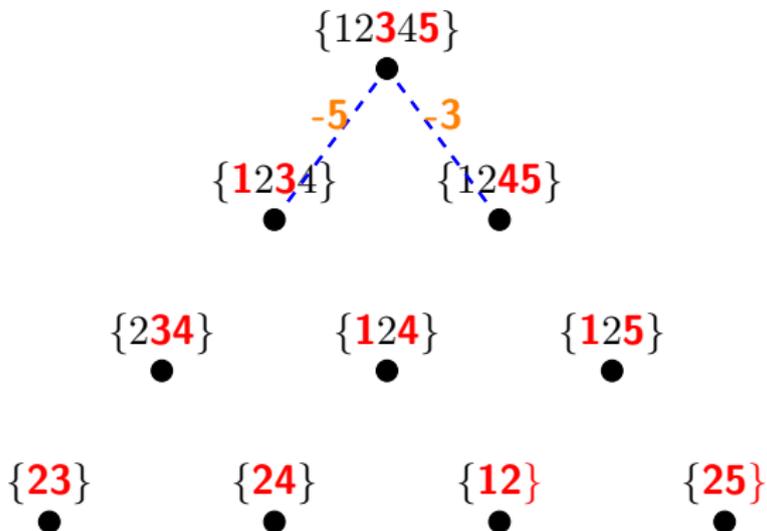
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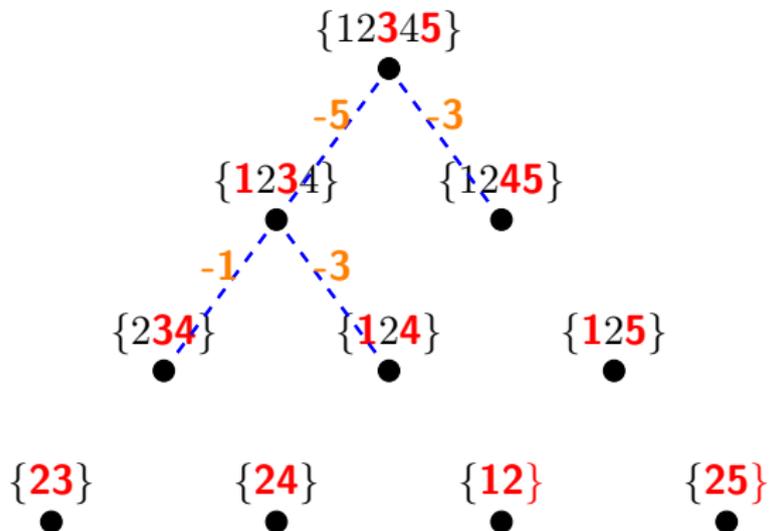
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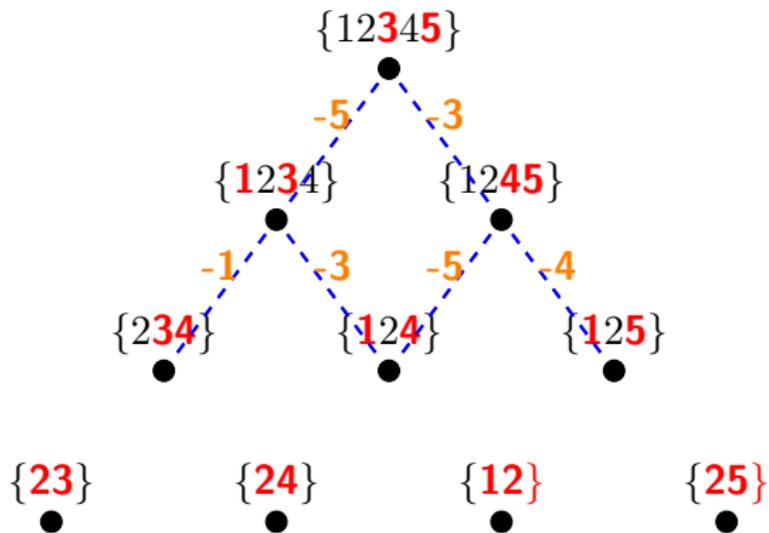
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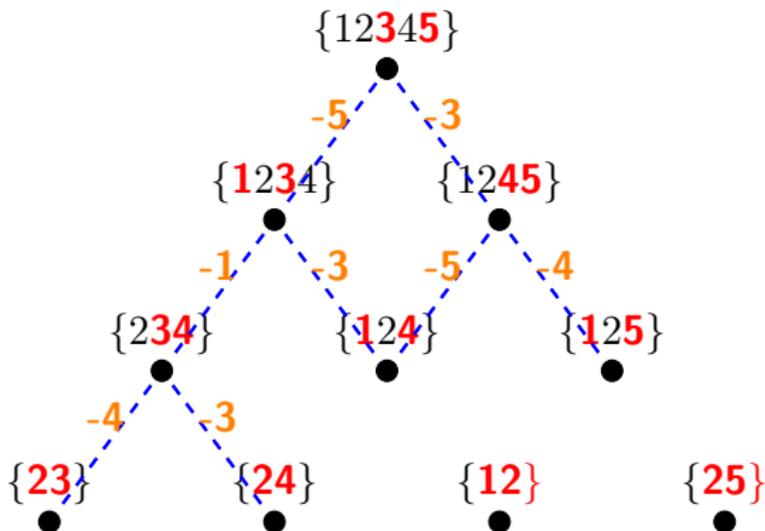
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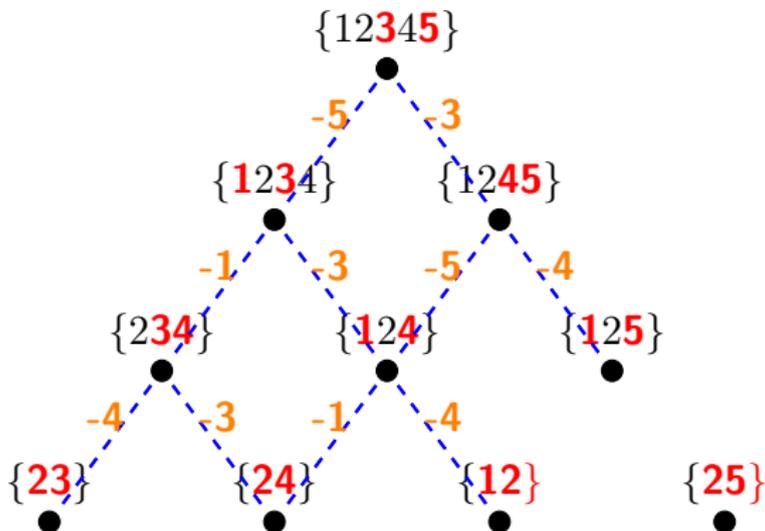
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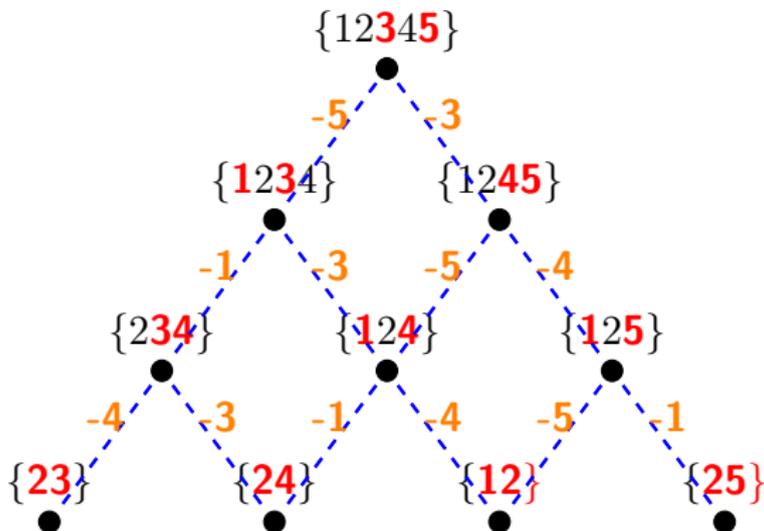
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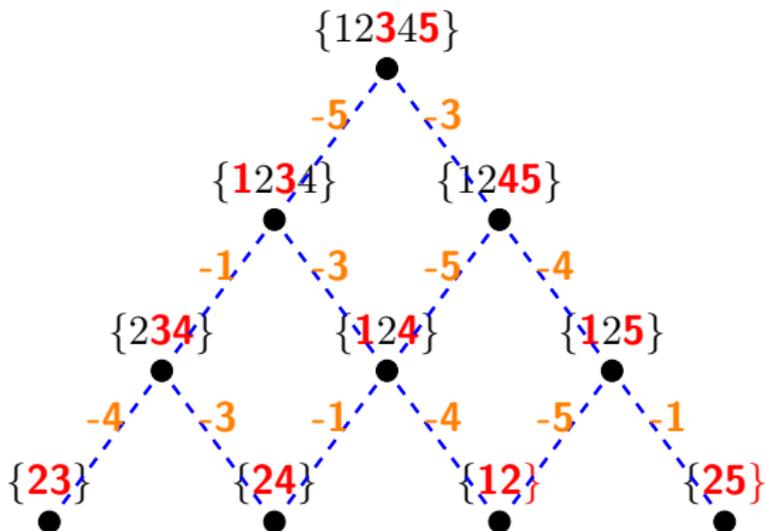
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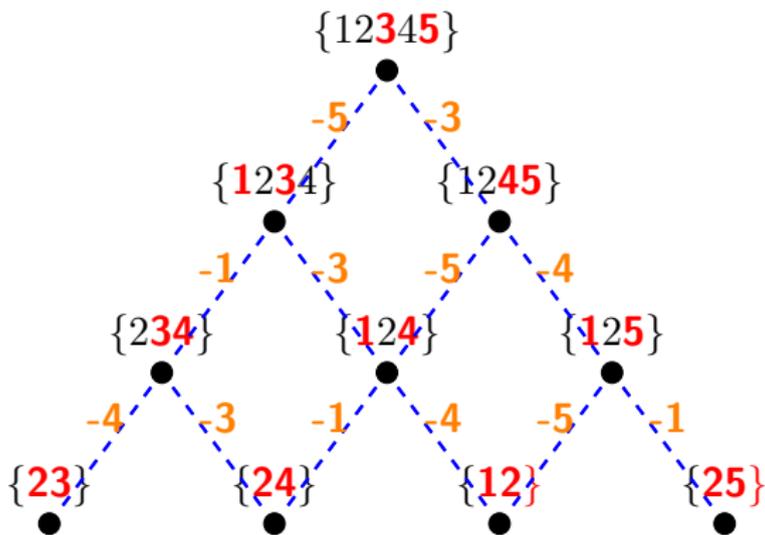
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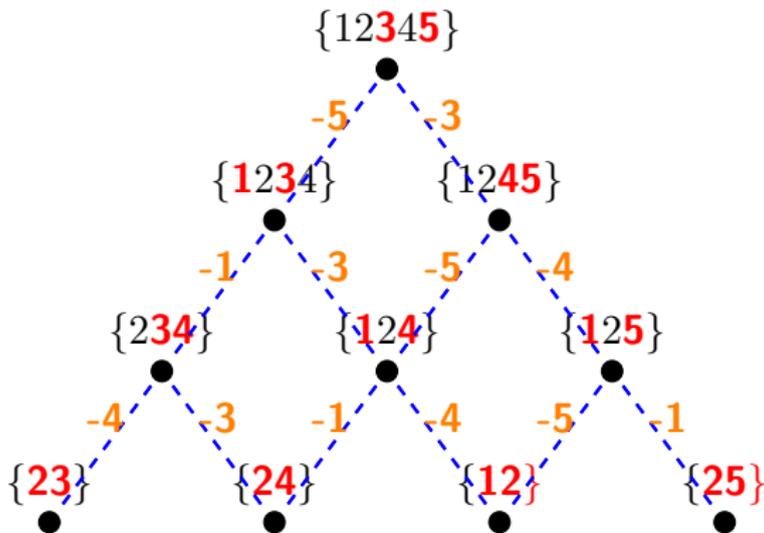
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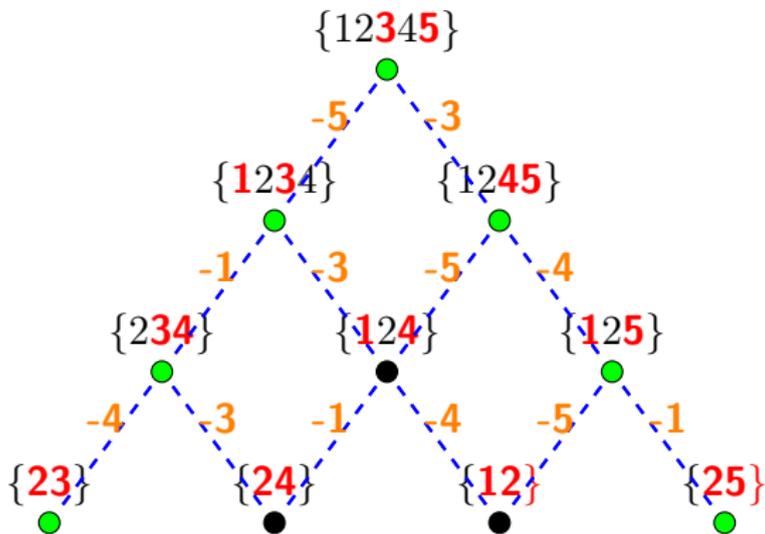
S is an ancestor of S' , denoted by $S \searrow S'$, if $S \rightarrow S_1 \rightarrow \cdots \rightarrow S_k \rightarrow S'$. Since \searrow is transitive, (\mathcal{M}, \searrow) is a poset.

┌ a chain ────┐



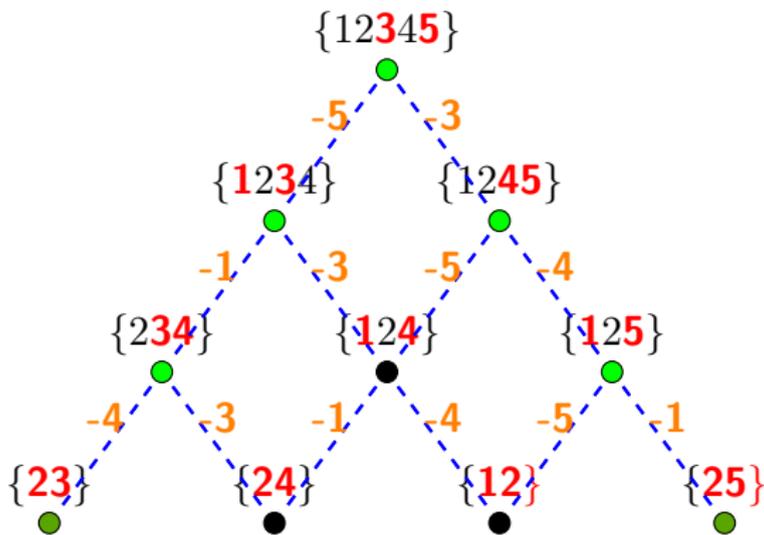
a chain in (\mathcal{M}, \searrow) is a linearly ordered subset of \mathcal{M} .

prime sets



$S \in \mathcal{M}$ is a **prime** if S has a unique parent, i.e., \exists a unique $S' \in \mathcal{M}$ s.t. $S' \rightarrow S$. Let \mathcal{P} denote the set of all primes.

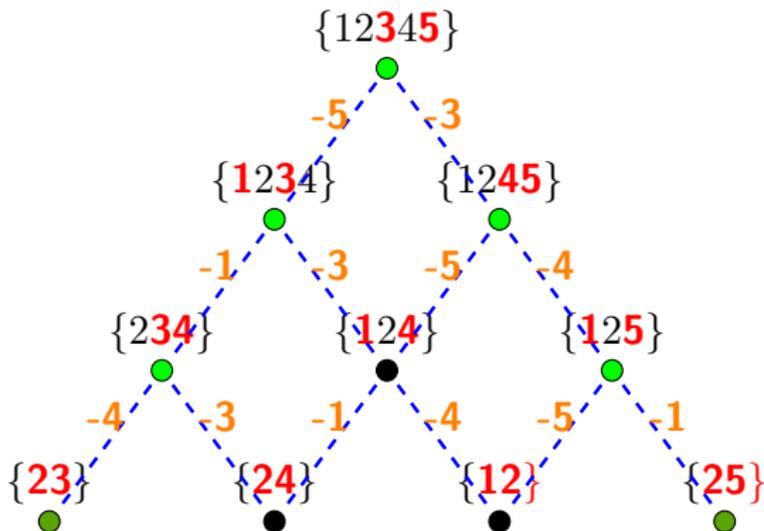
prime chains & prime atoms



$S_1, \dots, S_k \in \mathcal{P}$ s.t. $S_1 \rightarrow \dots \rightarrow S_k$ is a **prime chain** from S_1 to S_k . Each $T \in \mathcal{M}$ with $|T| = q$ is an **atom**, if T is also a prime, then T is a **prime atom**.

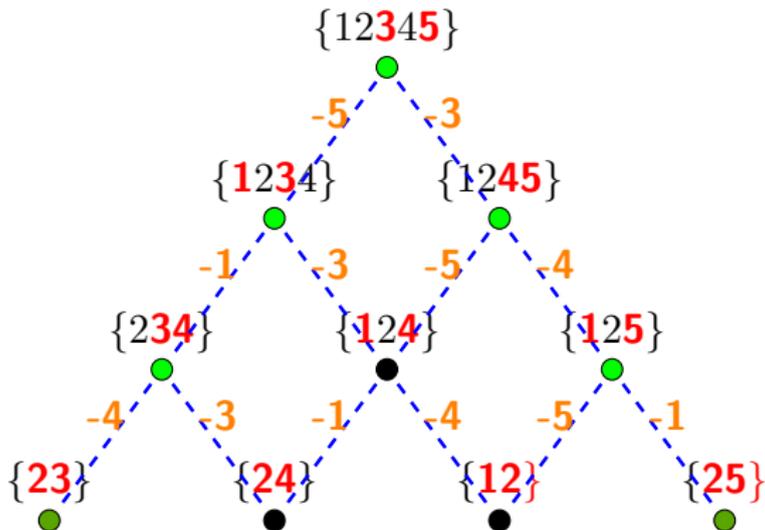
Main observations

┌ prime atoms = critical sets ───



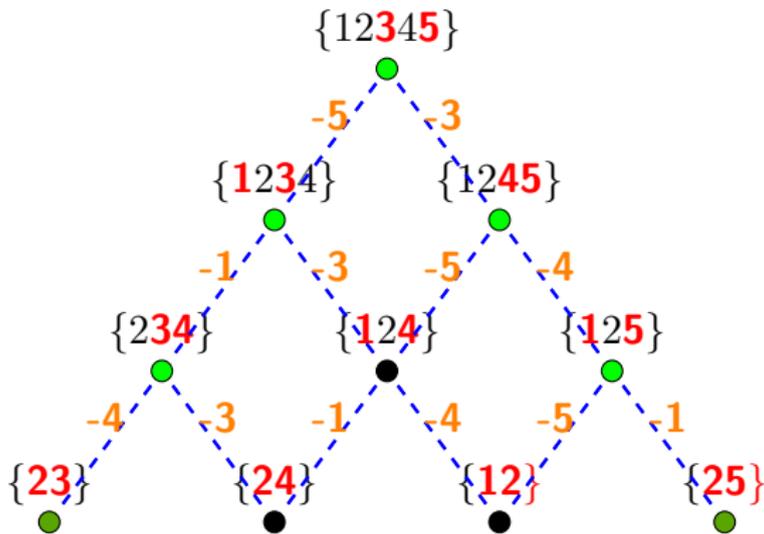
Lemma 1: A choice set is critical if and only if it is a prime atom.

each prime has a prime child



Lemma 2: Each prime choice set has a unique prime child.

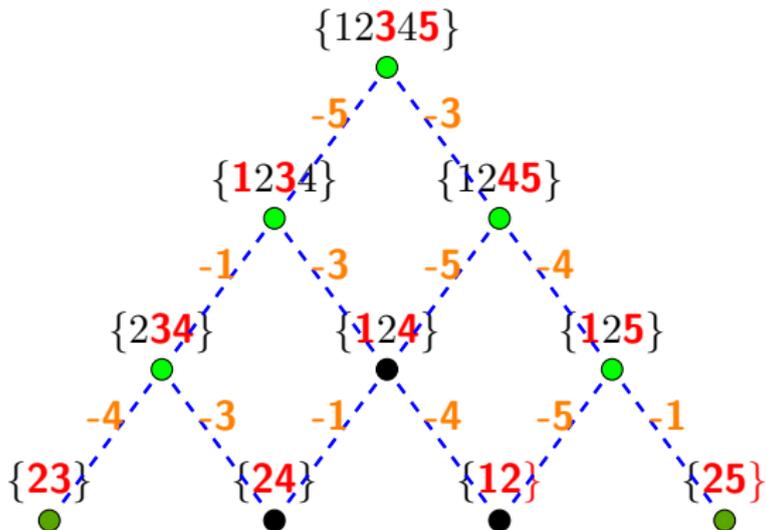
primes carry the whole choice info.



Lemma 3: For each nonprime maximal choice set S and its parent $S \cup \{a\}$, there exists a maximal choice set $S' \in \mathcal{M}$ such that $S \cup \{a\} \subsetneq S'$ and $a \in C(S')$.

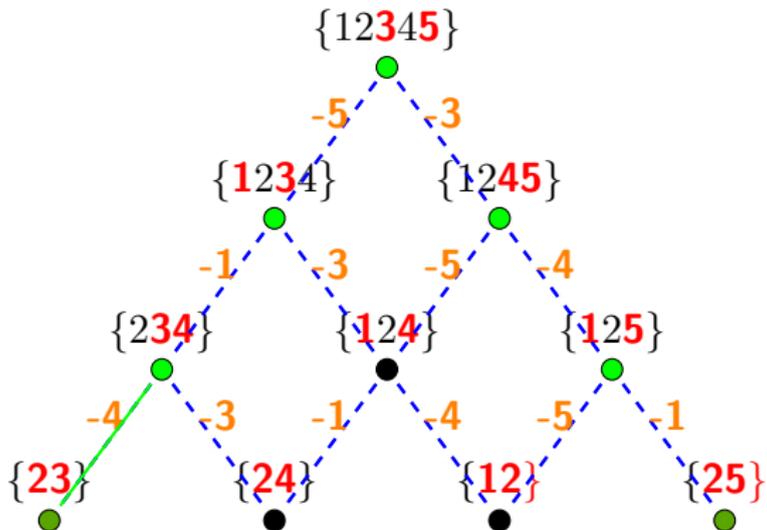
Construction of the priorities

└─ priorities ─┘



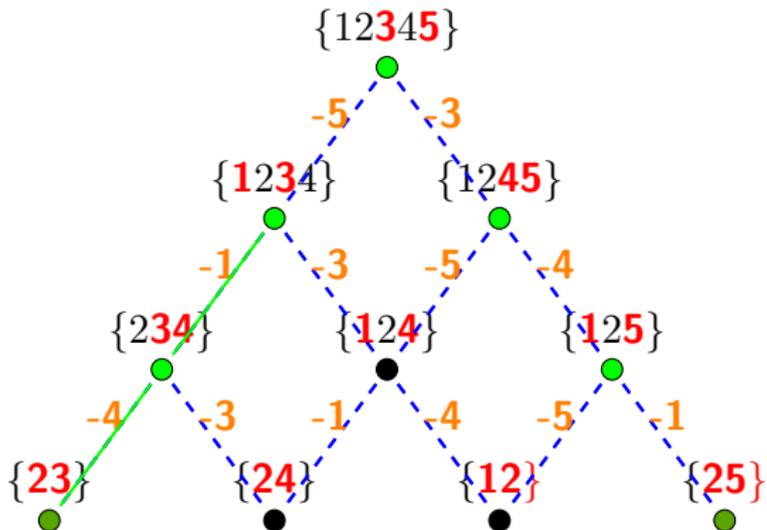
We construct an ordering associated with each **prime atom**.

└─ priorities ─┘



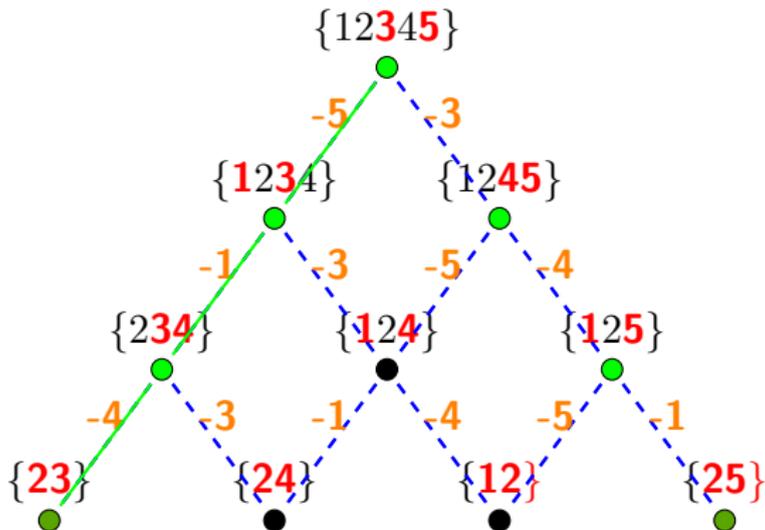
We construct an ordering associated with each **prime atom**.

└─ priorities ─┘



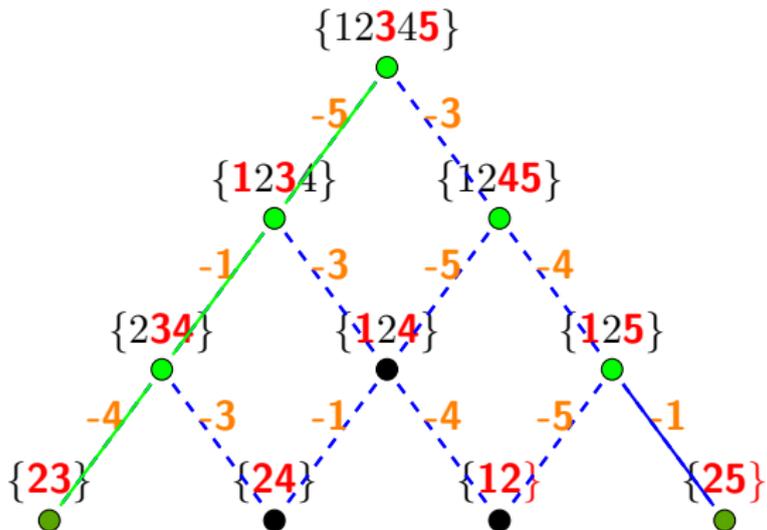
We construct an ordering associated with each **prime atom**.

└ priorities ───



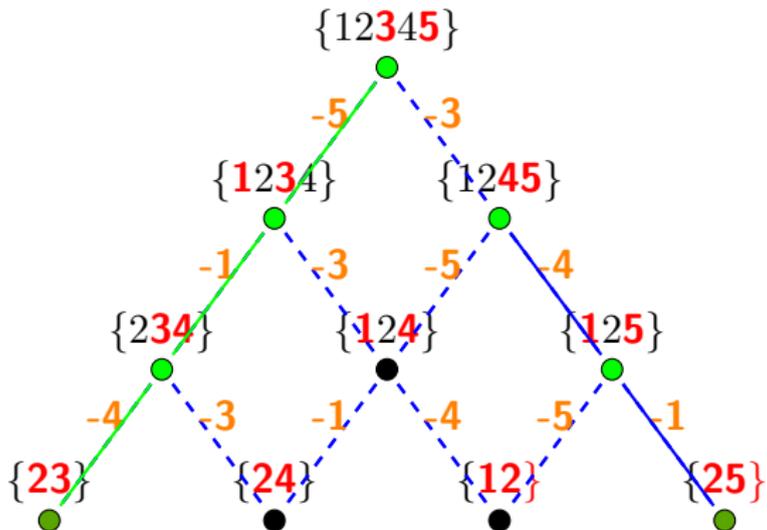
We construct an ordering associated with each **prime atom**.

└─ priorities ─┘



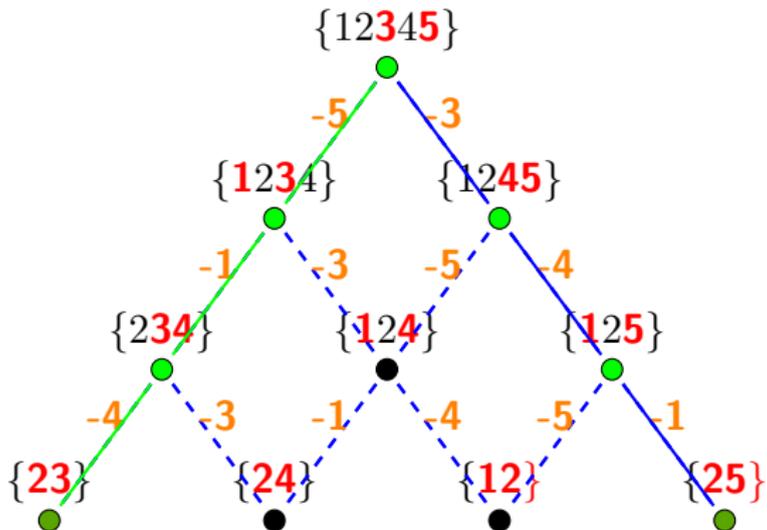
We construct an ordering associated with each **prime atom**.

└ priorities ───



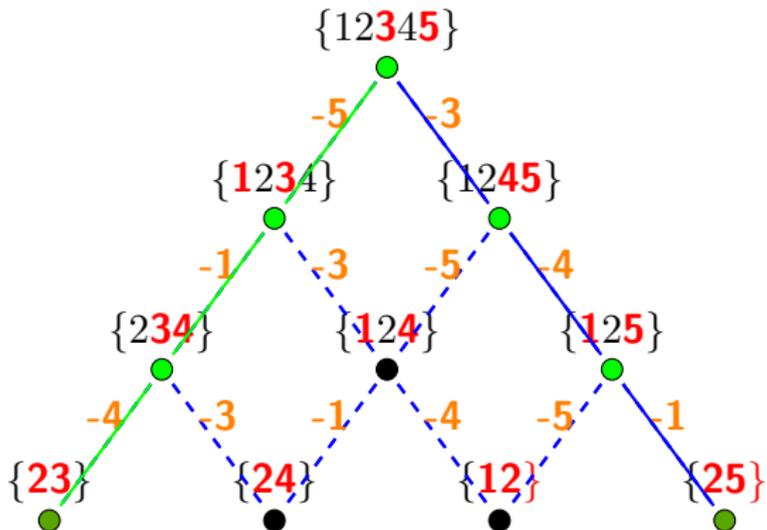
We construct an ordering associated with each prime atom.

└ priorities ───



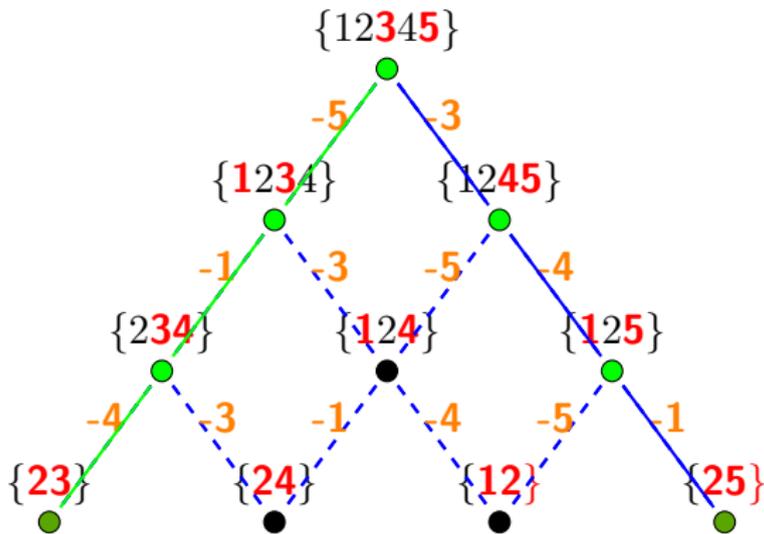
We construct an ordering associated with each prime atom.

└ priorities ───



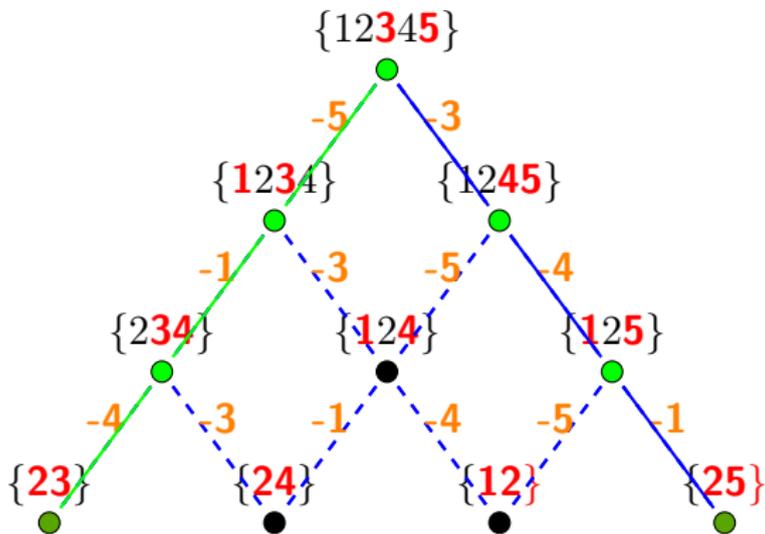
We construct an ordering associated with each **prime atom**.

┌ priorities ────



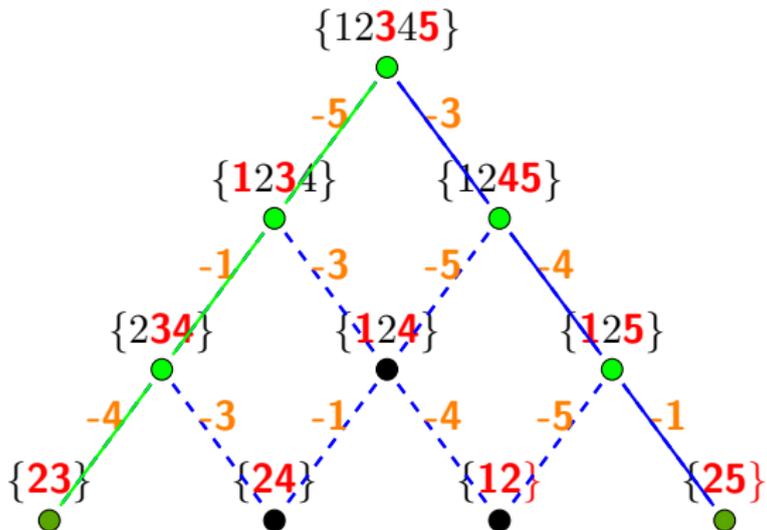
Lemma 3: For each nonprime maximal choice set S and its parent $S \cup \{a\}$, there exists a maximal choice set $S' \in \mathcal{M}$ such that $S \cup \{a\} \subsetneq S'$ and $a \in C(S')$.

└ priorities ─



Lemma 3 \Rightarrow it is sufficient to maximize priorities that passes through the prime sets.

└ priorities ───



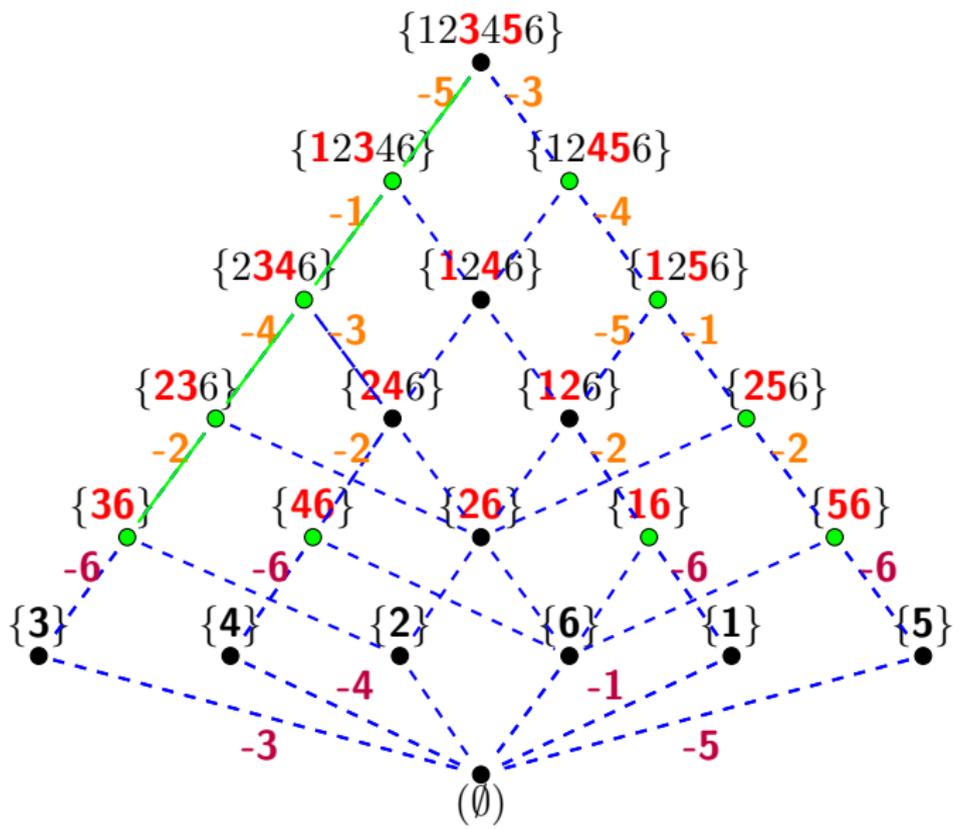
Lemma 2: Each prime choice set has a unique prime child.

resulting priority profile

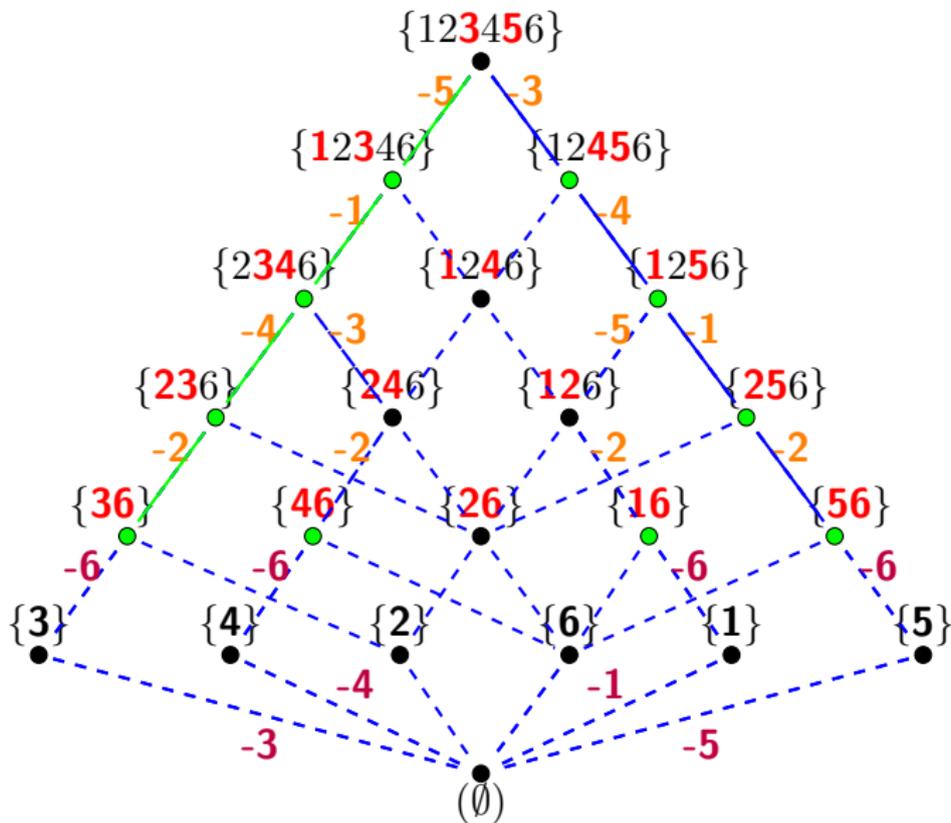
γ_α	γ_β
5	3
1	4
4	1
2	2
3	5

Back

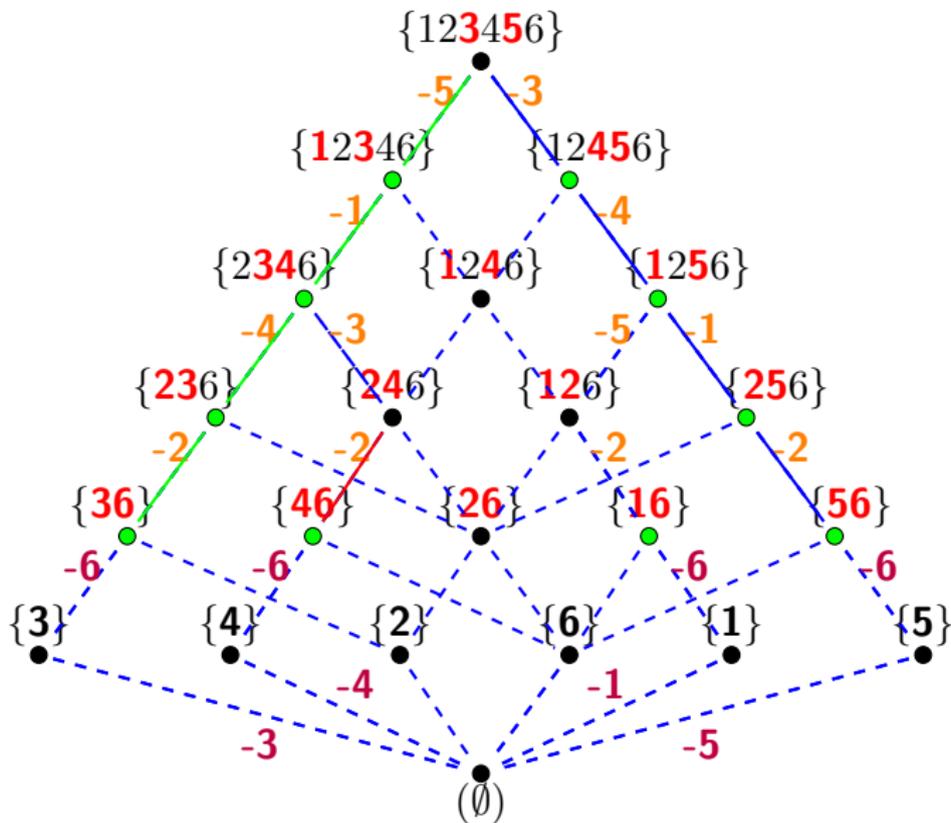
┌ general case ────┐



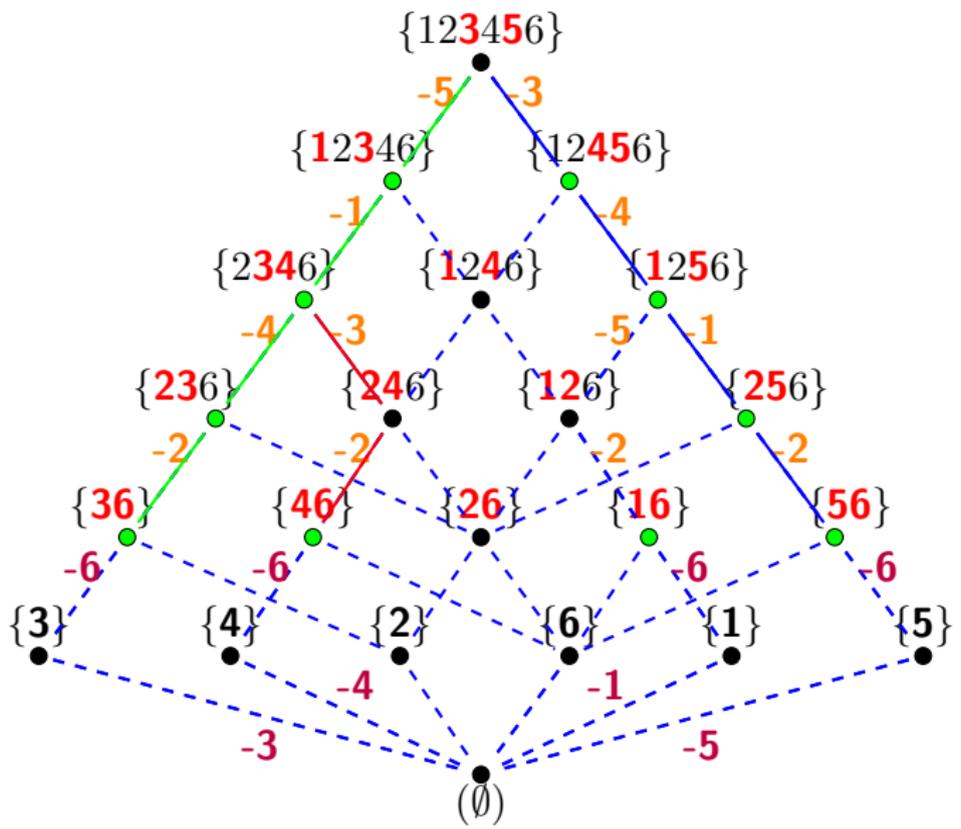
general case



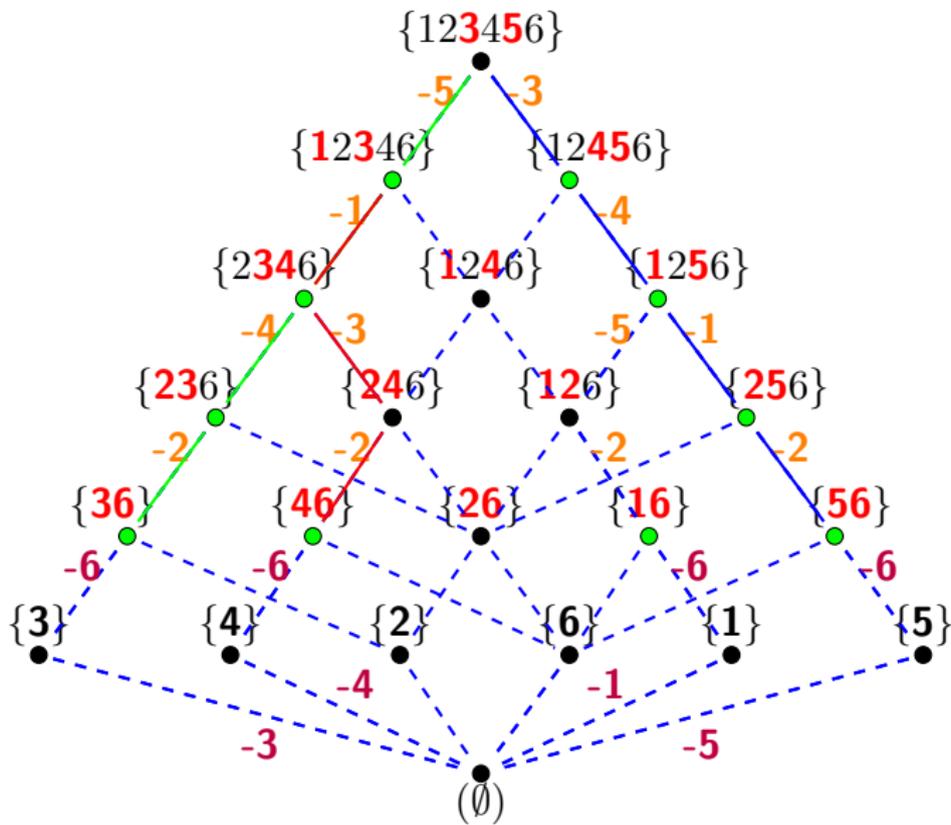
general case



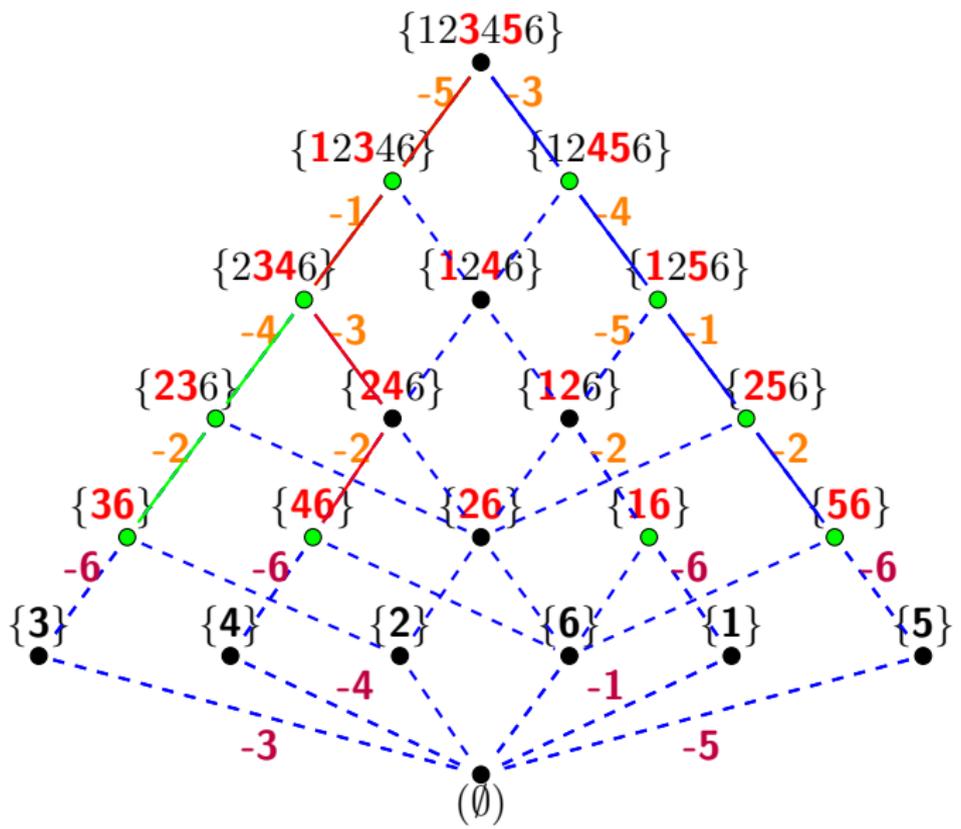
┌ general case ────┐



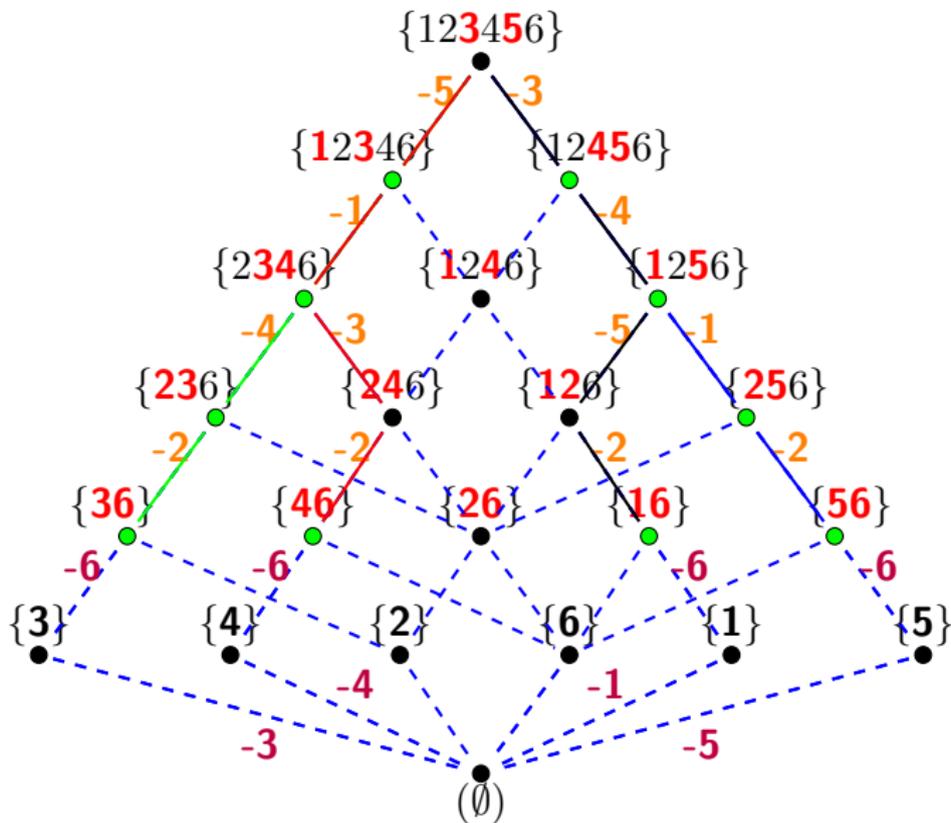
general case



└── general case ──



general case



resulting priorities

γ_α	γ_β	γ_γ	γ_δ
5	5	3	3
1	1	4	4
4	3	5	1
2	2	2	2
6	6	6	6
3	4	1	5

Back

resulting priorities

γ_α	γ_β	γ_γ	γ_δ
5	5	3	3
1	1	4	4
4	3	5	1
2	2	2	2
6	6	6	6
3	4	1	5

Back