

# THE D-BASE OF FINITE CLOSURE SYSTEMS

Simon Vilmin (LIS, Aix-Marseille Université, France)

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Joint work with:

([arXiv link](#))

Kira Adaricheva (Math dpt., Hofstra University)

Lhouari Nourine (LIMOS, Université Clermont Auvergne, France)

# Closure systems (and their representations) are ubiquitous

Logic, algebra,  
argumentation, ...

$A \rightarrow B$

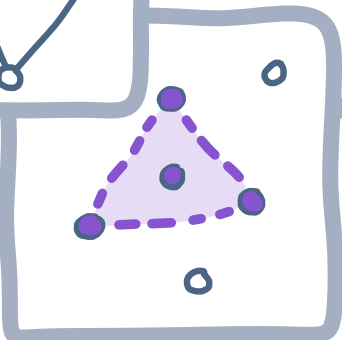
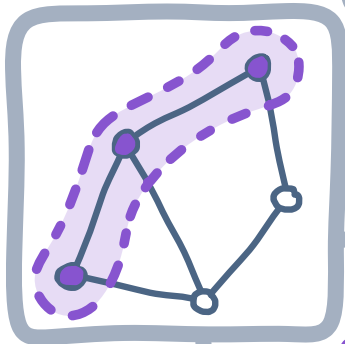
$$\gamma \vee \bigvee_{i=1}^n \neg x_i$$



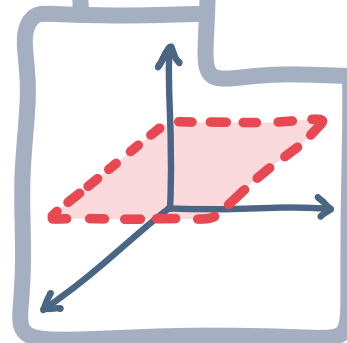
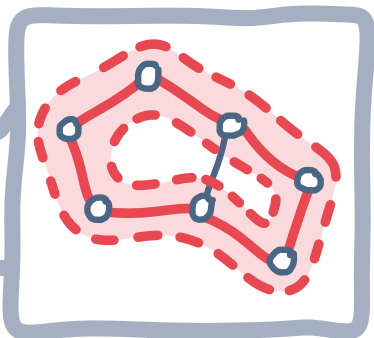
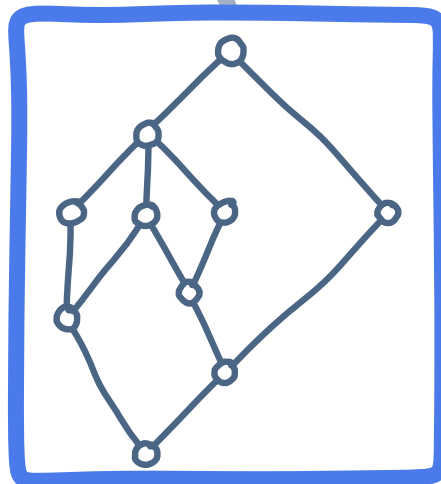
	a	b	c
1	x	x	
2		x	
3			x

DB, FCA,  
Data mining,  
KST, ...

	A	B	C
	b	1	⊥
	a	2	T
	a	1	T



Convexity



Matroids

PART I: what is the D-base

from closure systems ...

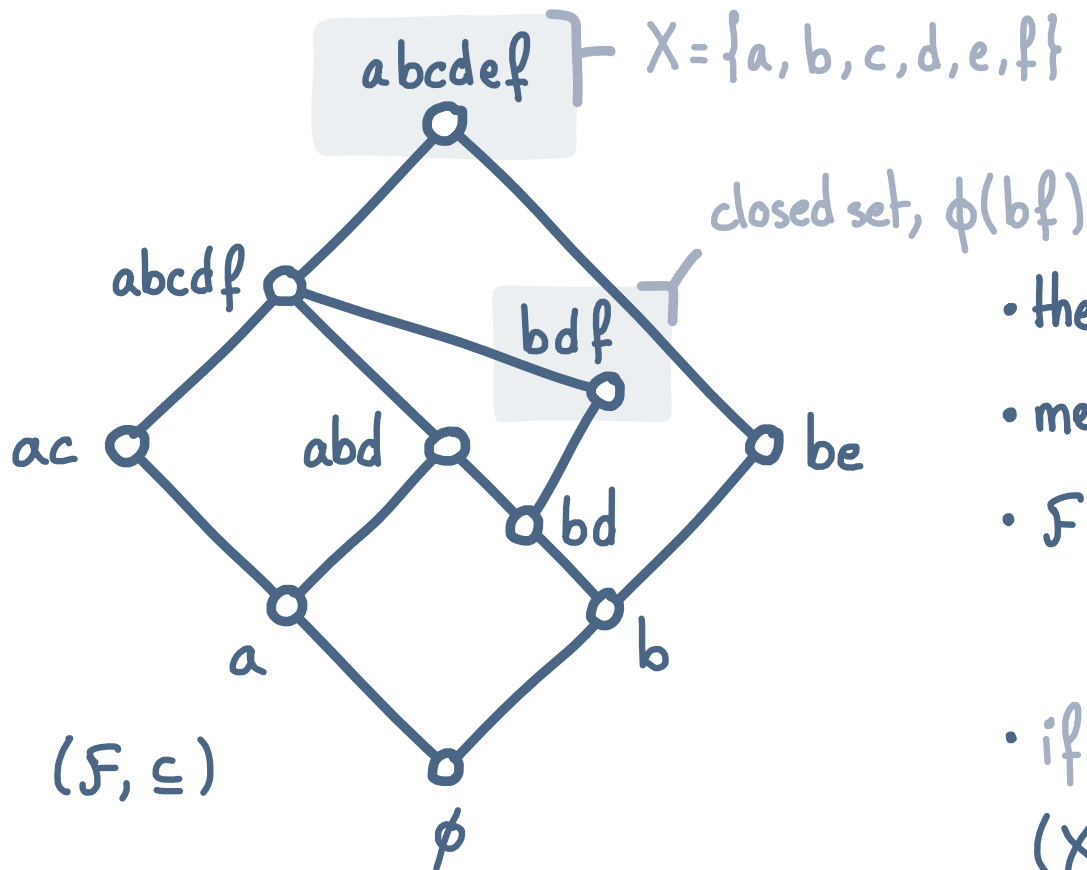
... to implications

PART II: computing the D-base from irreducible closed sets

PART I : What is the D-base

First : what is a closure system ?

DEF: a closure system is a pair  $(X, \mathcal{F})$  where  $X$  is a groundset and  $\mathcal{F} \subseteq 2^X$  is closed under intersection and contains  $X$ .



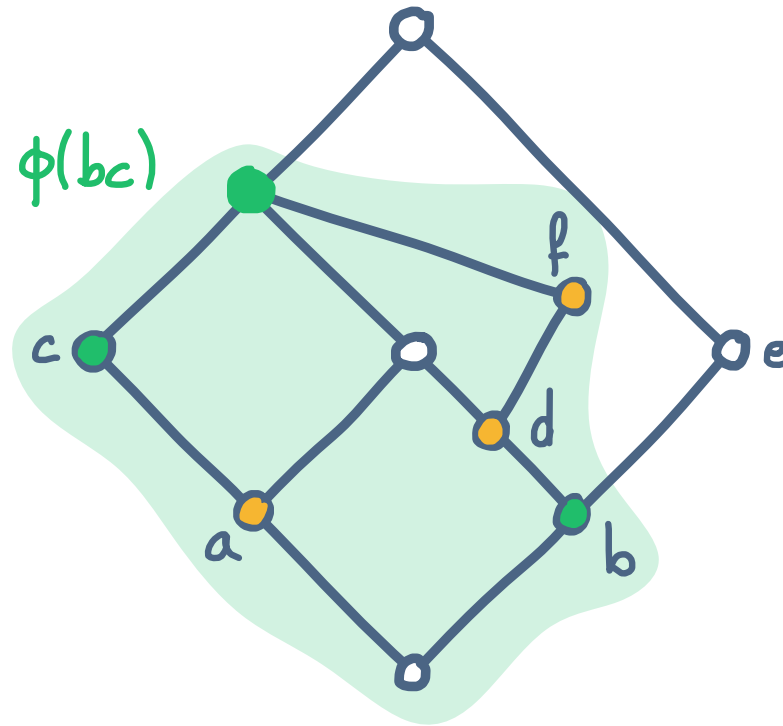
- the poset  $(\mathcal{F}, \subseteq)$  is a (closure) lattice
- members of  $\mathcal{F}$  are closed sets
- $\mathcal{F}$  induces a closure operator  $\phi$

$$\phi(A) = \min_{\subseteq} \{F : F \in \mathcal{F}, A \subseteq F\}$$

- if  $\mathcal{F}$  also closed under union,  $(X, \mathcal{F})$  is distributive

## Reconstructing $F$ from $X$ and the diagram

$$abcdnf = \phi(bc)$$

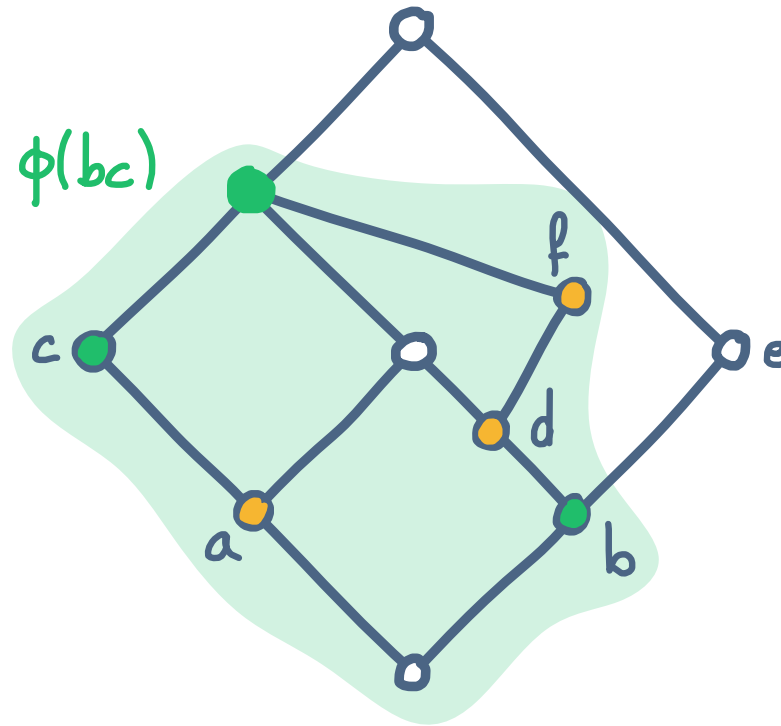


How to (visually) compute closures with the diagram:

- (1) for each  $x \in X$ , give the label  $x$  to  $\phi(x)$
- (2) for  $A \subseteq X$ , take the minimal point above the labels of  $A$
- (3)  $\phi(A)$  is the set of labels below this point

A relation on  $X$  to describe  $F$

$$abcdf = \phi(bc)$$



$\phi(bc)$  captures  $a, d, f$ . We can write this as implications

$$bc \rightarrow a, bc \rightarrow d, bc \rightarrow f$$

**IDEA** : describe the (structure of the) closure system by means of implications

## A long-standing question

Dilworth, 40 : unique irreducible decompositions in locally distributive lattices ( $\simeq$  convex geometries)

Finkbeiner, 51 : dependence relation (= implications)

Jónsson, Nation, 77 : join-refinement, minimal join covers (implications of the  $\Delta$ -base) for free lattices

Gaskill, Rival, 78 : use of "minimal pairs" in modular lattices (=  $\Delta$ -base)



## A long-standing question

Day, 79 : study of (lower, upper) bounded lattices  
with relations on join-covers ( $\Delta$ -relation,  $\Delta$ -base)

Faigle, 86 : minimal pairs in geometric lattices

Nation, 90 : OD-graph ( $\Delta$ -base)

Freese et al., 95 : book on free lattices

Leading to the  $\Delta$ -base

Adaricheva et al., 13 : introduction of the  $\Delta$ -base

Rodríguez et al., 15, 17 : computing  $\Delta$ -base with simplification logic (from implications)

Adaricheva, Nation, 17 : computing  $\Delta$ -base with hypergraph dualization (from context)

our contribution

Adaricheva, Nourine, Vilmin, 25+ : output-sensitive study of  $\Delta$ -base computation, with implications or irreducible closed sets (= binary data)

In other fields

**IDEA :** describe the (structure of the) closure system by means of implications

is the same as finding, e.g.:

a Horn CNF for a Horn function (logic)

a cover of Functional Dependencies in a relation (databases)

association rules (with support 1) in transactions (data mining)

and generalizes finding, e.g.:

the circuits of a matroid

the minimal transversals of a (hyper)graph

## Back to implications

DEF: an implication over  $X$  is a statement  $A \rightarrow x$ , with  $A \subseteq X$  and  $x \in X$ . An implicational base (IB) is a pair  $(X, \Sigma)$  where  $\Sigma$  is a set of implications over  $X$ .

An IB  $(X, \Sigma)$  encodes a closure system  $(X, \mathcal{F})$  where:

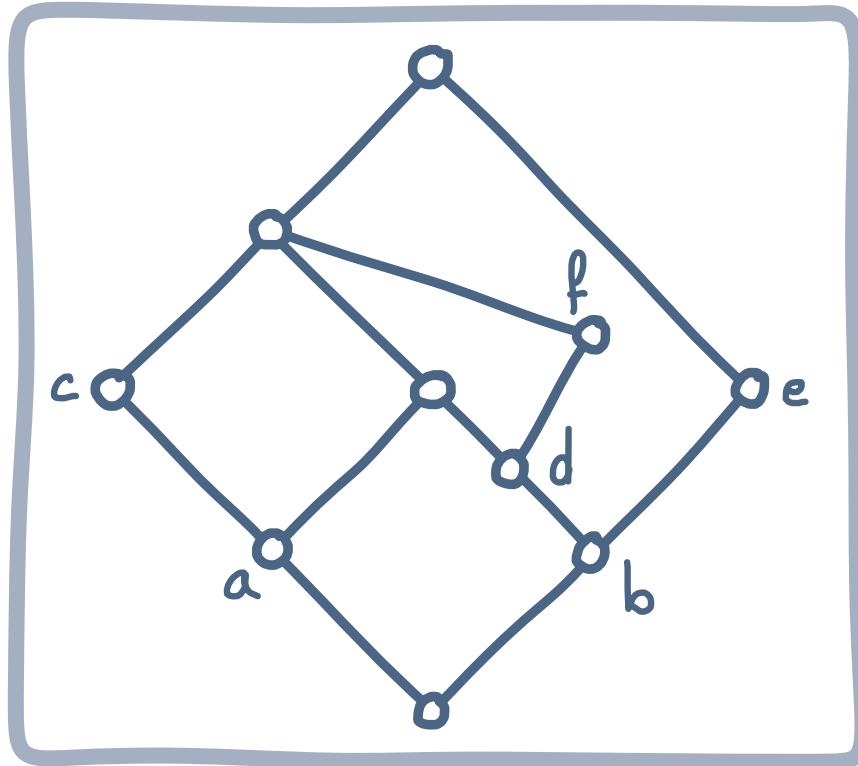
$$\mathcal{F} = \{F : A \subseteq F \text{ implies } x \in F \ \forall A \rightarrow x \in \Sigma\}$$

A closure system can be represented by many (equivalent) IBs

$$A \rightarrow x \text{ holds in } (X, \mathcal{F}) \text{ iff } x \in \phi(A)$$

On our example

$(\mathcal{F}, \subseteq)$



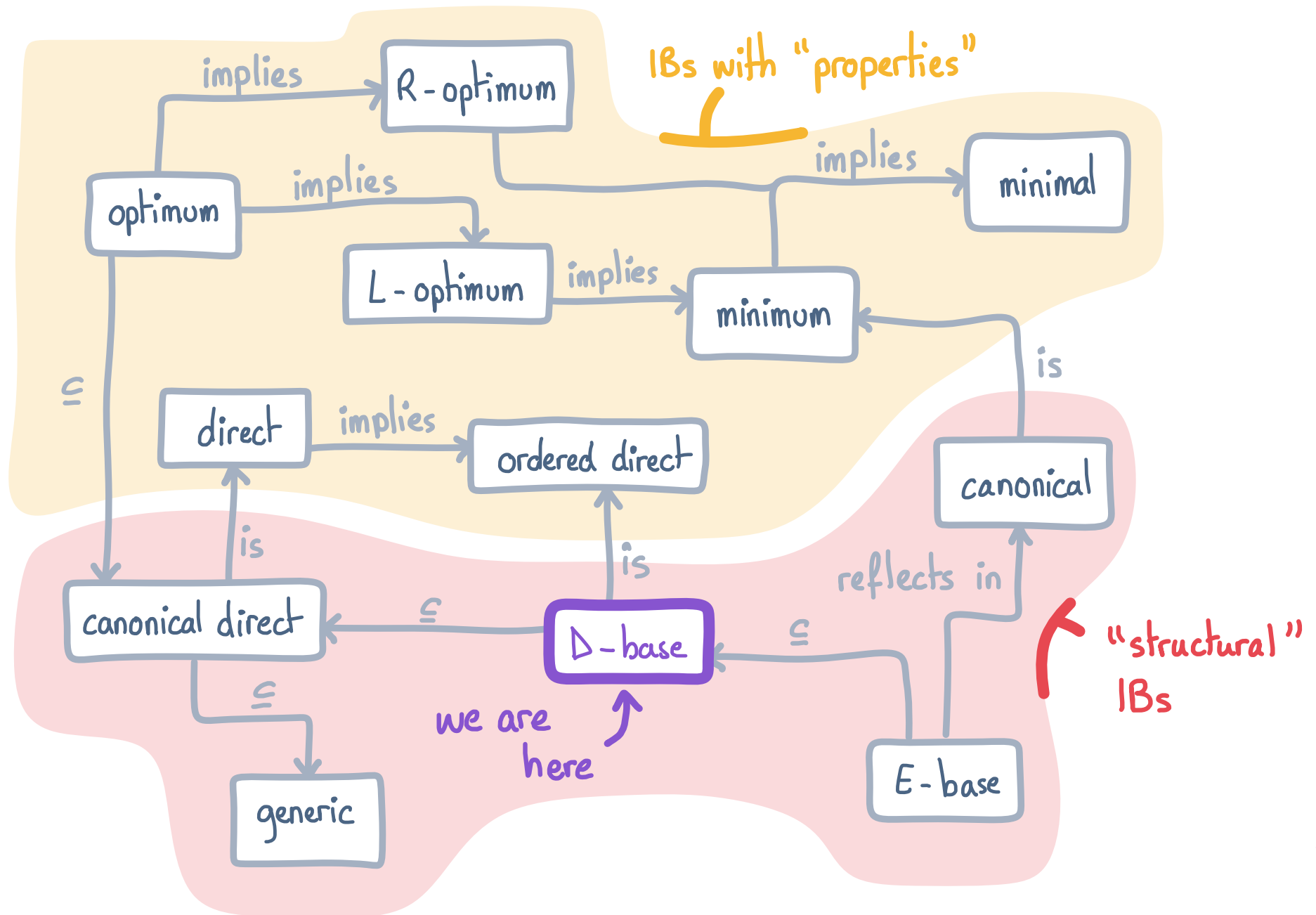
$x \in \phi(A)$

$c \rightarrow a, ab \rightarrow d, d \rightarrow b,$   
 $aeb \rightarrow c, fbe \rightarrow a,$   
 $bc \rightarrow f, f \rightarrow d, e \rightarrow b$

forward chaining

An IB  $(X, \Sigma)$   $\frac{11}{36}$

# the (partial) landscape of IBs



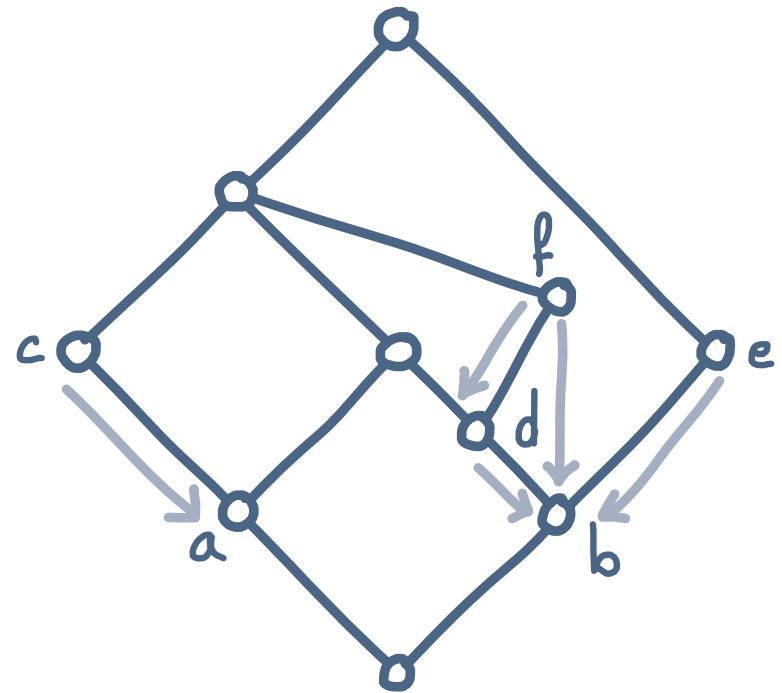
## $\Delta$ -base : intuition

**IDEA** : for each  $x \in X$ , find all the “minimal explanations” of  $x$

The way elements of  $X$  are ordered :

$a$  is below  $c$  ( $a \in \phi(c)$ )

$d$  is below  $f$  ( $d \in \phi(f)$ )



Represented by binary implications :

$c \rightarrow a$ ,  $f \rightarrow d$ ,  $f \rightarrow b$ ,  $d \rightarrow b$ ,  $e \rightarrow b$

## $\Delta$ -base : intuition

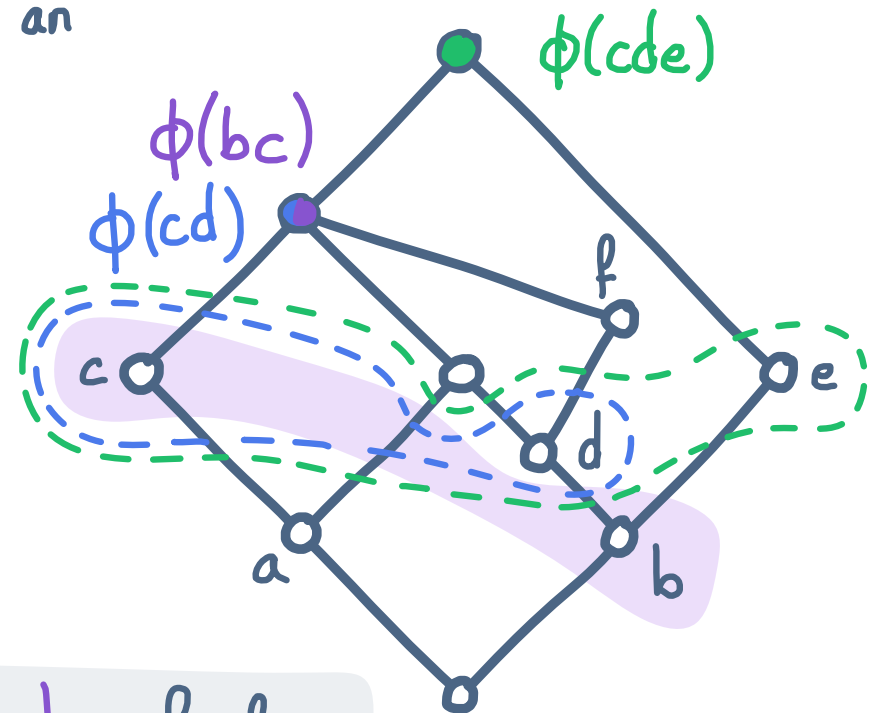
**IDEA** : for each  $x \in X$ , find all the "minimal explanations" of  $x$

Minimal (non-singleton) sets capturing an element

$$f \in \phi(cde)$$

$$f \in \phi(cd) \text{ and } cd \subset cde$$

$$f \in \phi(bc) \text{ and } bc \text{ "refines" } cd$$

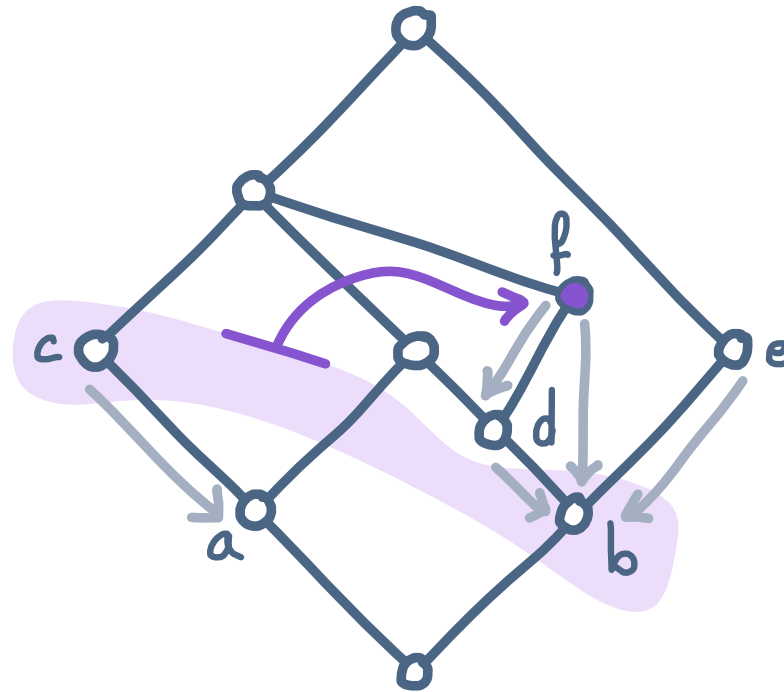


$bc$  is minimal: it is a  $\Delta$ -generator of  $f$ .  
The implication  $bc \rightarrow f$  will be in the  $\Delta$ -base



$\Delta$ -base : intuition

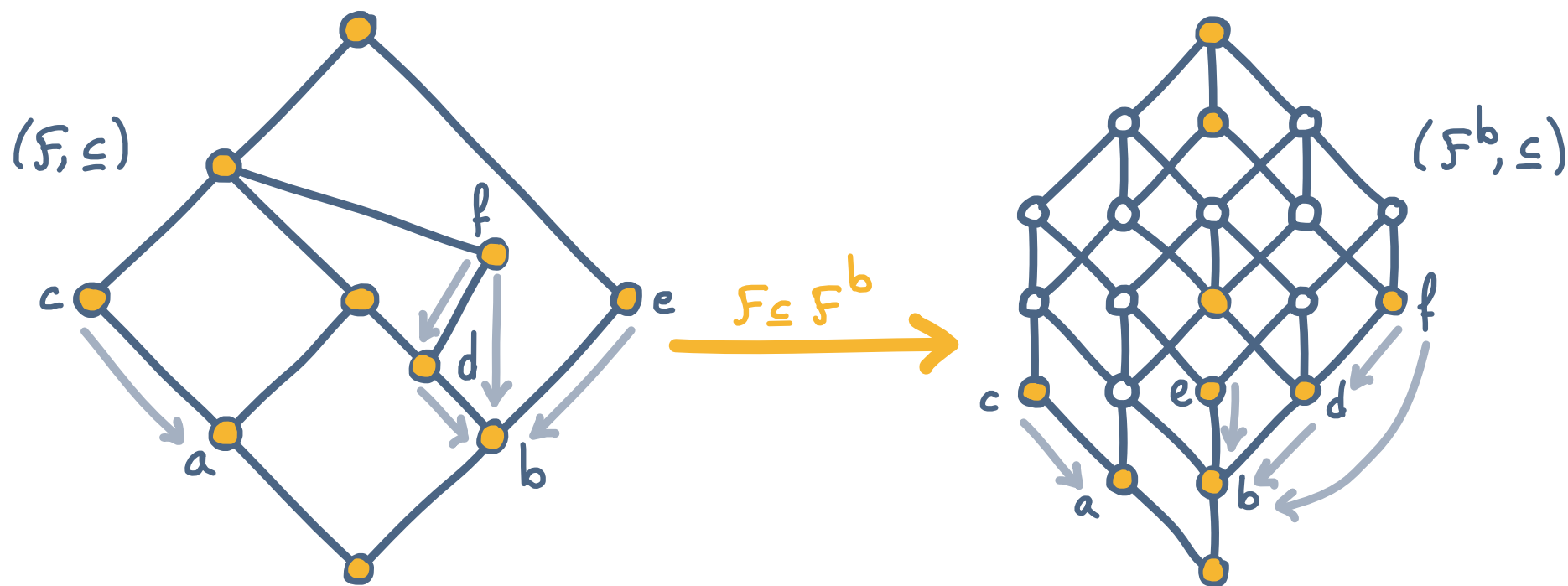
**IDEA** : for each  $x \in X$ , find all the “minimal explanations” of  $x$



$\Delta$ -base = order on  $X$  +  $\Delta$ -generators

Formalization : binary part

$\Delta EF$ : the binary part of  $(X, F)$  is the closure system  $(X, F^b)$  with  $\phi^b(A) = \bigcup \{ \phi(a) : a \in A \}$  for  $A \subseteq X$ . The IB  $(X, \Sigma^b)$  with  $\Sigma^b = \{ a \rightarrow x : x \in \phi(a), x \neq a \}$  represents  $(X, F^b)$



$$\Sigma^b = \{ c \rightarrow a, f \rightarrow d, f \rightarrow b, d \rightarrow b, e \rightarrow b \}$$

## Formalization: $\Delta$ -generator, $\Delta$ -base Adaricheva et al., 13

DEF: a subset  $A$  of  $X$  is a  $\Delta$ -generator of  $x$  if  $x \in \phi(A)$  but  $x \notin \phi^b(A)$  and  $\forall B \subseteq X$ :

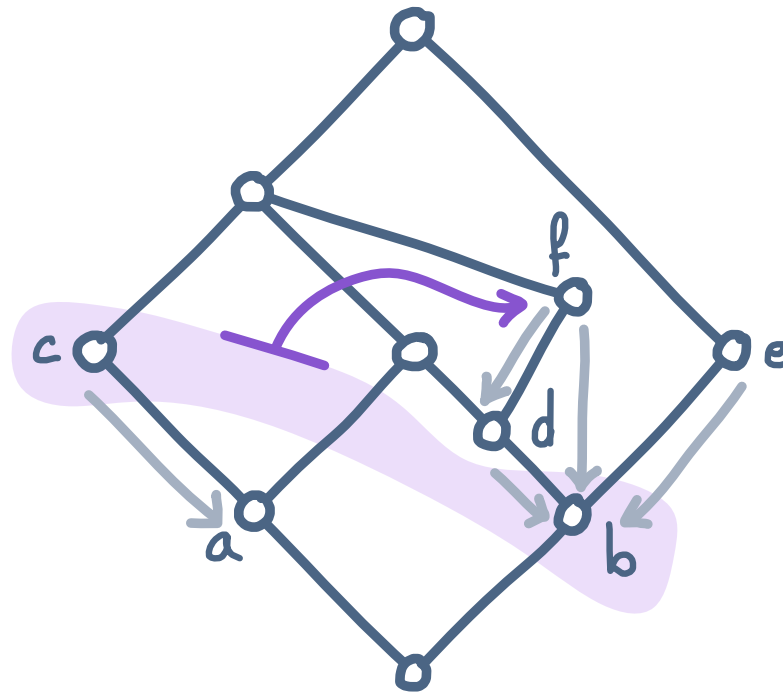
- $\phi^b(B) = \phi^b(A)$  implies  $A \subseteq B$
- $\phi^b(B) \subset \phi^b(A)$  implies  $x \notin \phi(B)$

} encodes minimality

DEF: the  $\Delta$ -base of  $(X, \mathcal{F})$  is the IB  $(X, \Sigma_\Delta)$  with  
 $\Sigma_\Delta = \Sigma^b \cup \{A \rightarrow x : x \in X, A \text{ } \Delta\text{-gen of } x\}$

RMK: why is it a valid IB? Take  $\gamma \subseteq X$ , any  $x \in \phi(\gamma) \setminus \gamma$  has a minimal explanation w.r.t.  $\gamma$ : follow  $\Sigma^b$ , find these explanations in  $\Sigma_\Delta \setminus \Sigma^b$  and use them.

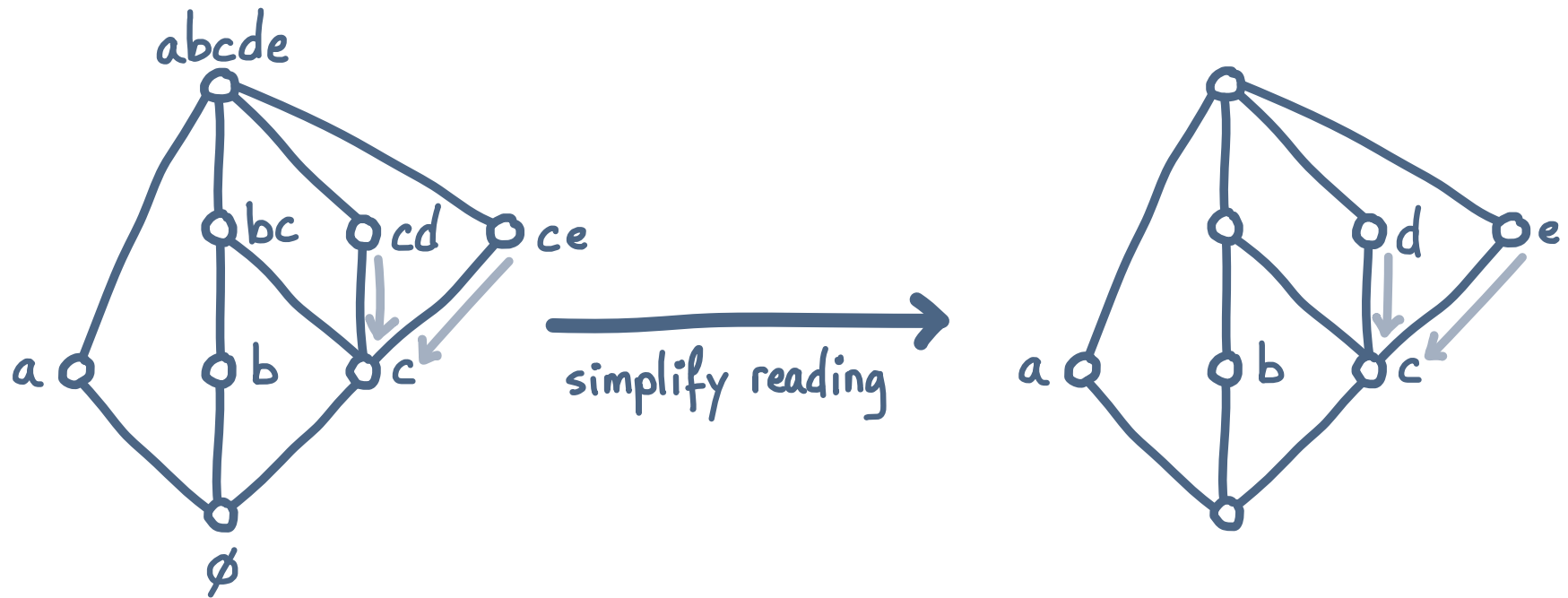
The D-base of our example



$$\Sigma_D = \left[ \begin{array}{l} c \rightarrow a, f \rightarrow d, f \rightarrow b, \\ d \rightarrow b, e \rightarrow b \end{array} \right] \cup \left[ \begin{array}{l} de \rightarrow a, \\ de \rightarrow c, ae \rightarrow c, af \rightarrow c, \\ ab \rightarrow d, \\ bc \rightarrow f, de \rightarrow f, ae \rightarrow f \end{array} \right]$$

PART II: Computing the  $\Delta$ -base  
from irreducible closed sets

A new example



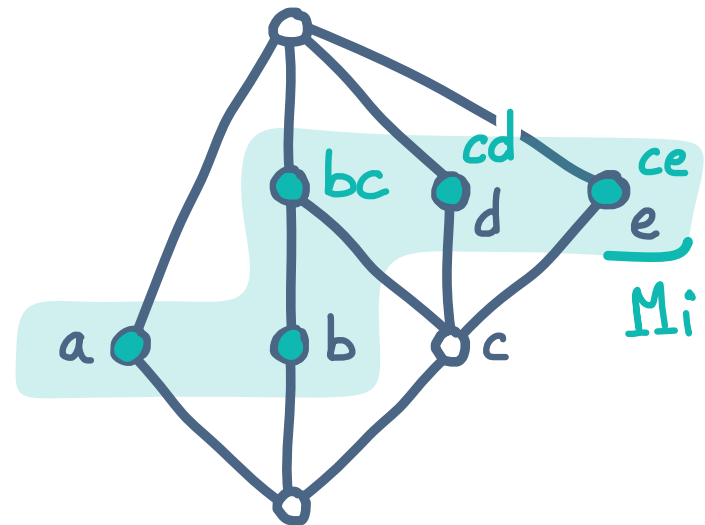
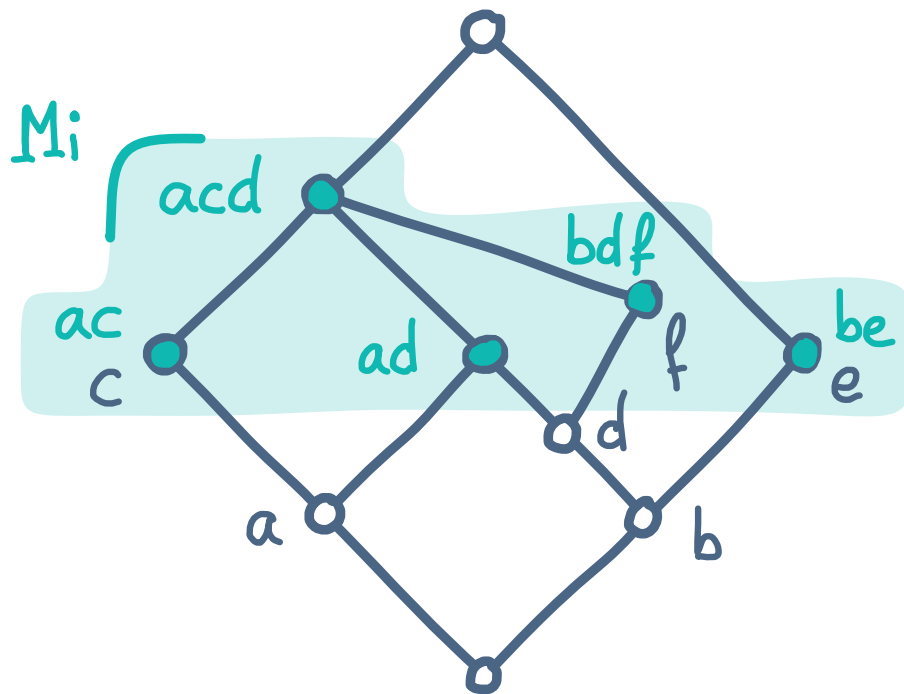
$$\Sigma_D = \{d \rightarrow c, e \rightarrow c\} \cup$$

$$\left[ \begin{array}{l} bd \rightarrow a, be \rightarrow a, de \rightarrow a, \\ ac \rightarrow b, de \rightarrow b, \\ ab \rightarrow c, \\ ab \rightarrow d, ac \rightarrow d, \\ ab \rightarrow e, ac \rightarrow e \end{array} \right]$$

Irreducible closed sets ?

DEF : a closed set  $M$  distinct from  $X$  is irreducible if it is not the intersection of other closed sets. We put

$$M_i = \{ M : M \in \mathcal{F}, M \text{ is irreducible} \}$$

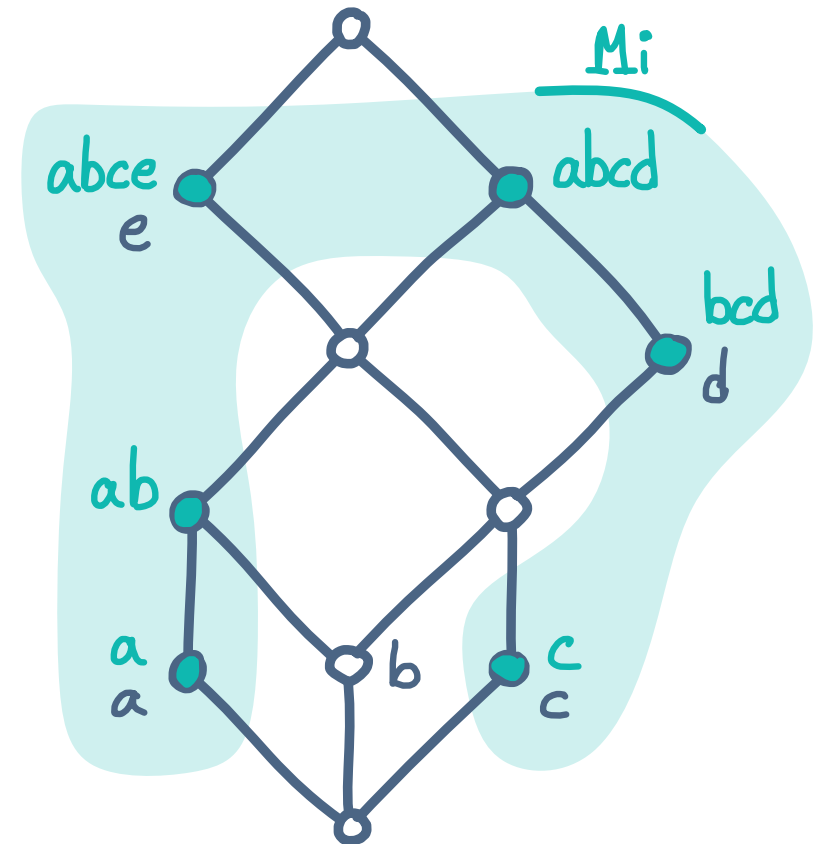


RMK :  $\mathcal{F}$  can be built from  $M_i$  using intersections

# Irreducibles and binary data

	a	b	c	d	e	
Folavril	x					a
Lazuli			x			c
Dupont	x	x				ab
Chloé		x	x	x		bcd
Wolf	x	x	x	x		abcd
Lil	x	x	x		x	abce

Lil bought product c



$ab \rightarrow c$  means "any person buying a and b also buys c"



## Problems

**PROB** : given irreducibles  $M_i$  over  $X$ ,  
find the  $\Delta$ -base  $(X, \Sigma_\Delta)$

**PROB** : given an implicational base  $(X, \Sigma)$   
find the  $\Delta$ -base  $(X, \Sigma_\Delta)$

**RMK** : enumeration tasks, listing implications  
without repetitions

# Further motivations for computing $(X, \Sigma_D)$

Theoretical / algorithmic properties :

- convey structural information of closure systems
- ordered direct (fast forward chaining)

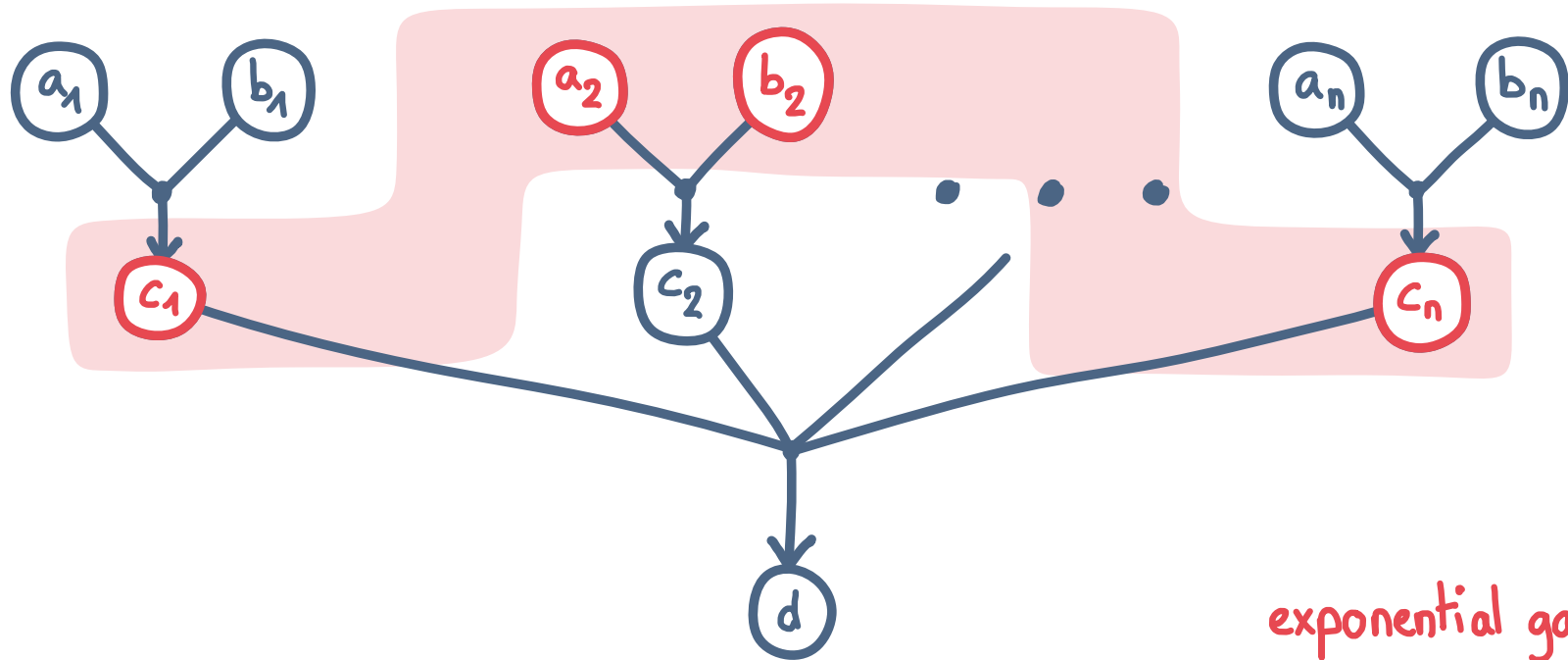
Practical uses :

- seabreeze forecast Adaricheva et al., 23
- stomach cancer risk estimation Nation et al., 21

Exponential blow up

$$X = \{a_1, \dots, a_n, b_1, \dots, b_n, c_1, \dots, c_n, d\}$$

$$\Sigma = \{a_i b_i \rightarrow c_i : 1 \leq i \leq n\} \cup \{c_1 \dots c_n \rightarrow d\}$$



$$\Sigma_D = \Sigma \cup \left\{ A \rightarrow d : A \in \prod_{i=1}^n \{a_i b_i, c_i\} \right\}$$

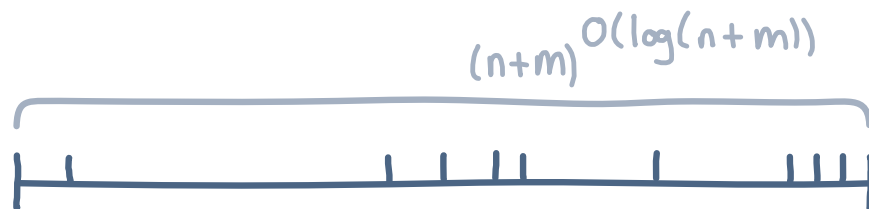
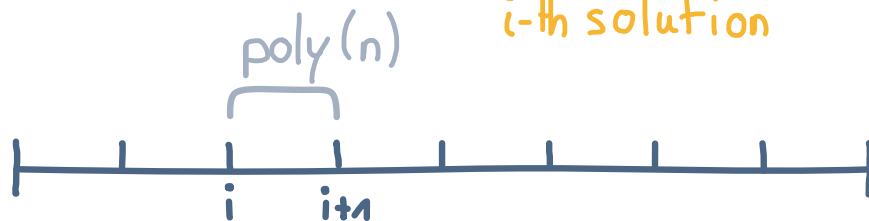
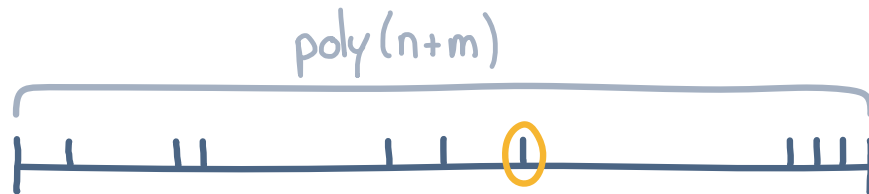
exponential gap w.r.t.  $\Sigma$ !

Enumeration: output-sensitive complexity

Each of size  $\text{poly}(x)$  ←

Enumeration task: with input  $x$ , list a set of solutions  $R(x)$

exec. time of  $A$



Enumeration algorithm  $A$

input  $x$  of size  $n$

output  $R(x)$  of size  $m$

Output polynomial time

polynomial delay

Output quasi-polynomial time  $\frac{25}{36}$

PROB : given irreducibles  $M_i$  over  $X$ ,  
find the  $\Delta$ -base  $(X, \Sigma_\Delta)$

- algorithm based on Hypergraph dualization Adaricheva, Naiton, 17  
produces (possibly large) superset of  $\Delta$ -base

**PROB :** given an implicational base  $(X, \Sigma)$   
find the D-base  $(X, \Sigma_D)$

- algorithm using simplification logic Rodriguez et al., 15, 17  
no (output-sensitive) complexity analysis
- poly-delay algorithm listing D-minimal keys Ennaoui, Nourine, 16  
based on solution-graph traversal  
→ ( $\hat{=}$  D-gen of some  $x$ )

Our results : part I

PROB : given irreducibles  $M_i$  over  $X$ ,  
find the  $\Delta$ -base  $(X, \Sigma_\Delta)$

Dualization of distributive lattices  
+ Elhassioni 22

THM: given  $M_i$  over  $X$ ,  $\Sigma_\Delta$  can be computed  
in output quasi-polynomial time

ANY, 25+

## Our results : part II

**PROB :** given an implicational base  $\Sigma$  over  $X$ ,  
find the D-base  $\Sigma_D$

Solution-graph traversal  
+ Ennaoui, Nourine 16

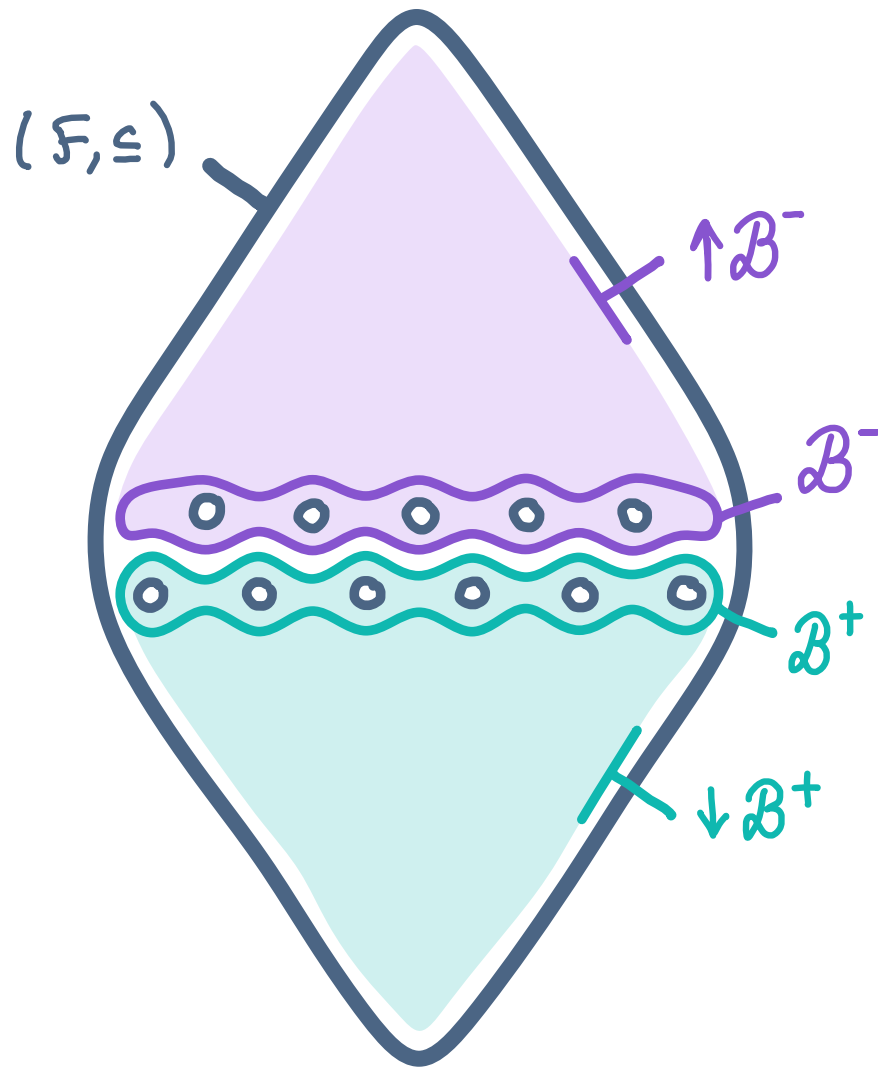
**THM :** given  $\Sigma$  over  $X$ ,  $\Sigma_D$  can be computed  
with polynomial delay

ANV, 25+



PROB: given irreducibles  $M_i$  over  $X$ ,  
find the  $\Delta$ -base  $(X, \Sigma_\Delta)$

# Dualization (with IBs)



$B^-$  and  $B^+$  antichains :

- families of incomparable closed sets

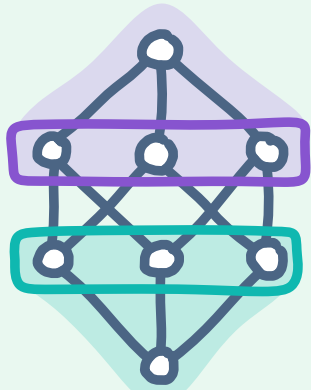
$B^-$  and  $B^+$  are dual :

- $\downarrow B^+ \cup \uparrow B^- = F$
- $\downarrow B^+ \cap \uparrow B^- = \emptyset$

PROB : given  $(X, \leq)$  and  $B^+$ , find  $B^-$

# Dualization complexity and $\Delta$ -base

Quasi-poly  
Fredman, Khachiyan, 96

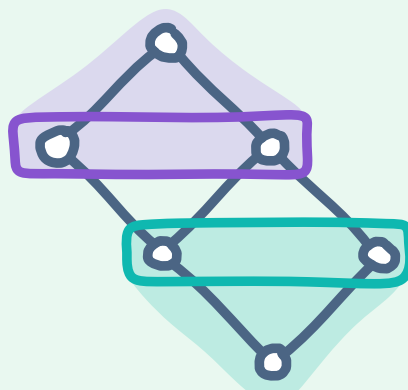


Boolean  
( $\approx$  powersets)



Hypergraph dualization  
Monotone dualization

Quasi-poly  
Elbassioni, 22



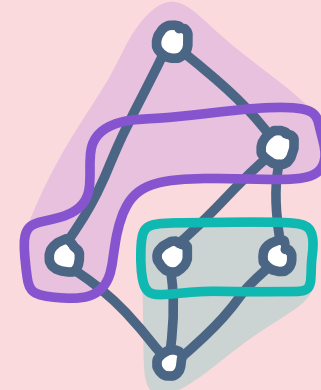
Distributive  
( $\cup, \cap$ -closed)



$\Delta$ -Base from  $M_i$

ANY, 25+

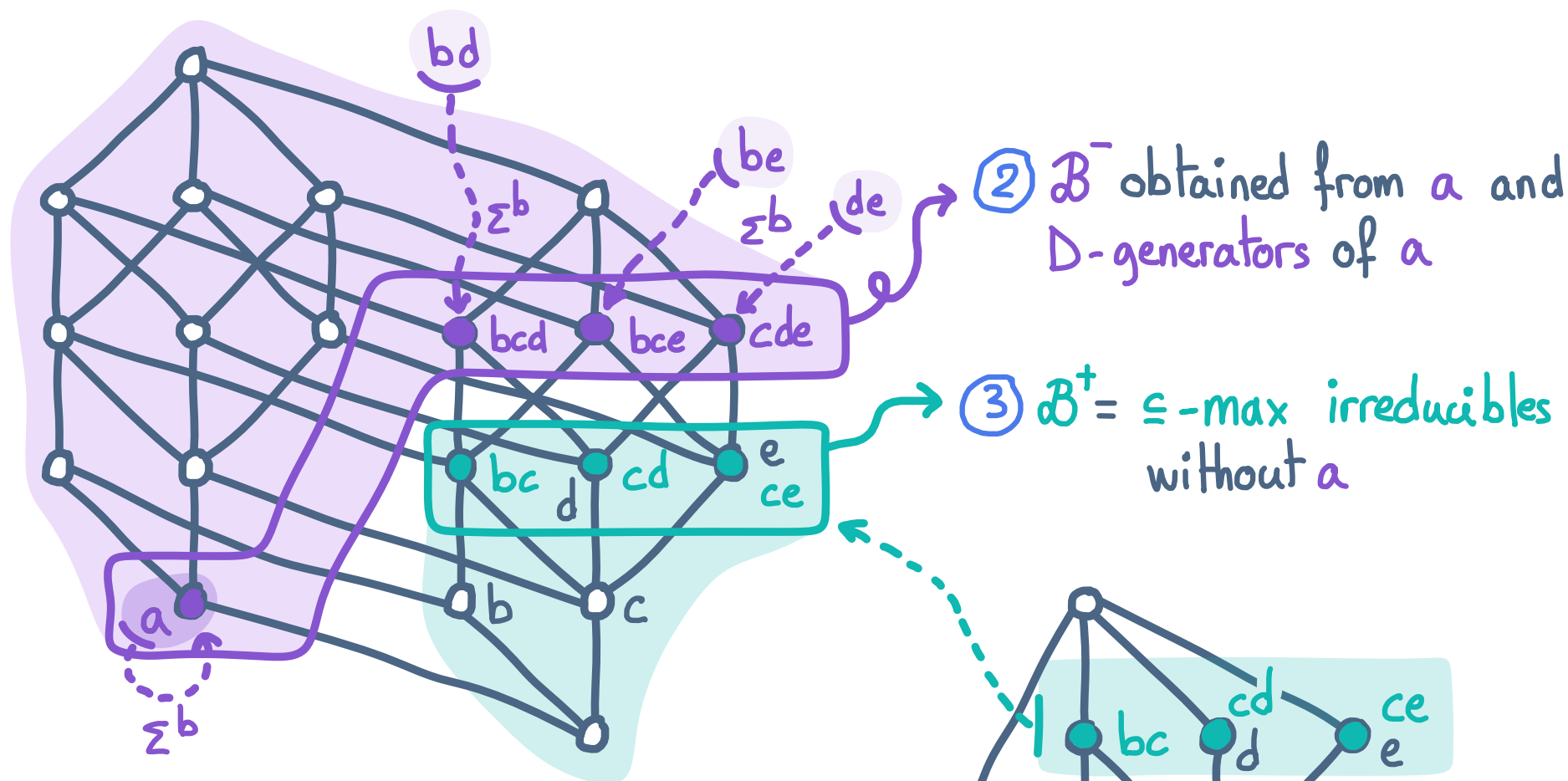
Hard  
Kavvadias et al., 00



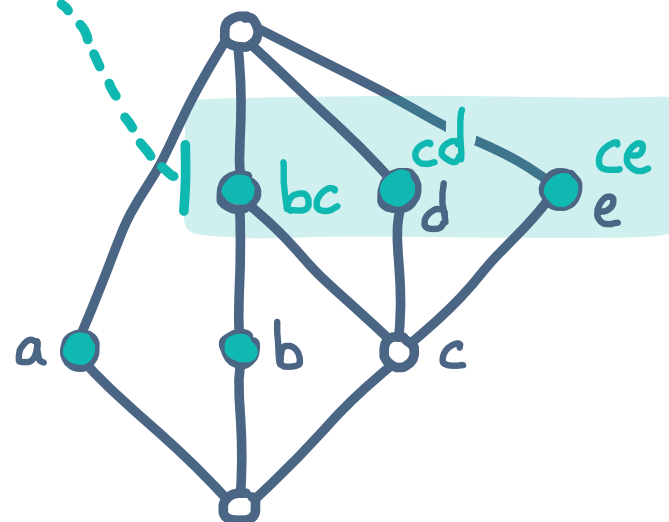
General

Classes of  
Closure systems

Intuition : D-base from  $M_i \leq$  Dual Distributive



①  $(\mathcal{F}^b, \leq)$  distributive  
 $\Sigma^b = \{d \rightarrow c, e \rightarrow c\}$

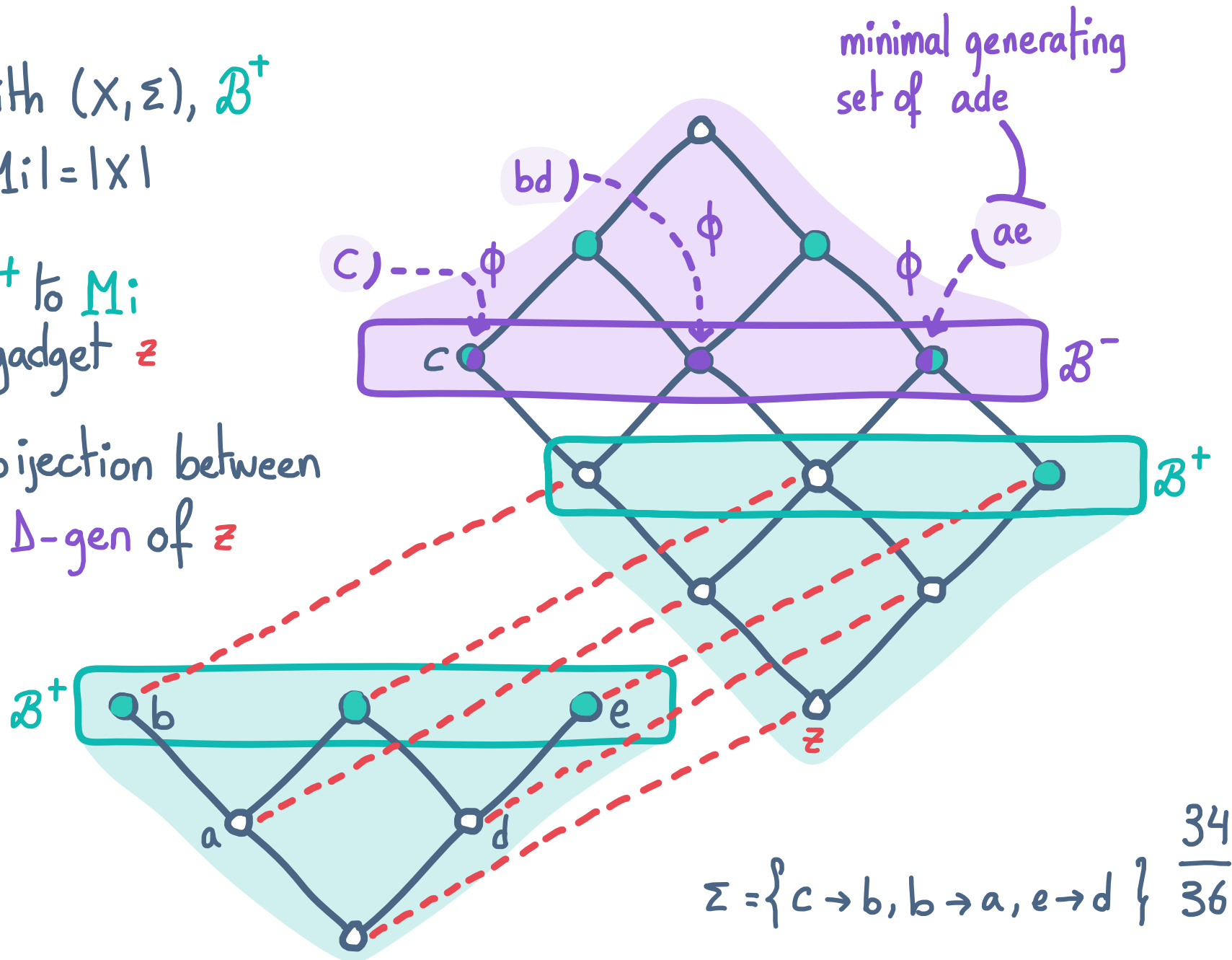


Intuition:  $\Delta$ -base from  $M_i \Rightarrow$  dual distributive

① Start with  $(X, \Sigma), \mathcal{B}^+$   
 $\text{Distr} \Rightarrow |M_i| = |X|$

② Add  $\mathcal{B}^+$  to  $M_i$   
 using gadget  $\bar{z}$

③  $\phi$  is a bijection between  
 $\mathcal{B}^-$  and  $\Delta$ -gen of  $\bar{z}$



PROB: given irreducibles  $M_i$  over  $X$ ,  
find the  $\Delta$ -base  $\Sigma_\Delta$

Dualization of distributive lattices  
+ Elhassioni 22

THM: given  $M_i$  over  $X$ ,  $\Sigma_\Delta$  can be computed  
in output quasi-polynomial time

ANV, 25+

# Conclusion

The D-base:

- describe a lattice by minimal join covers
- ordered direct subset of canonical direct base

Finding the D-base:

- output quasi-poly from  $M_i$
- poly-delay from  $\Sigma$

Questions regarding E-base (subset of D-base)

- Characterize systems with valid E-base
- Similar algorithms for E-base?

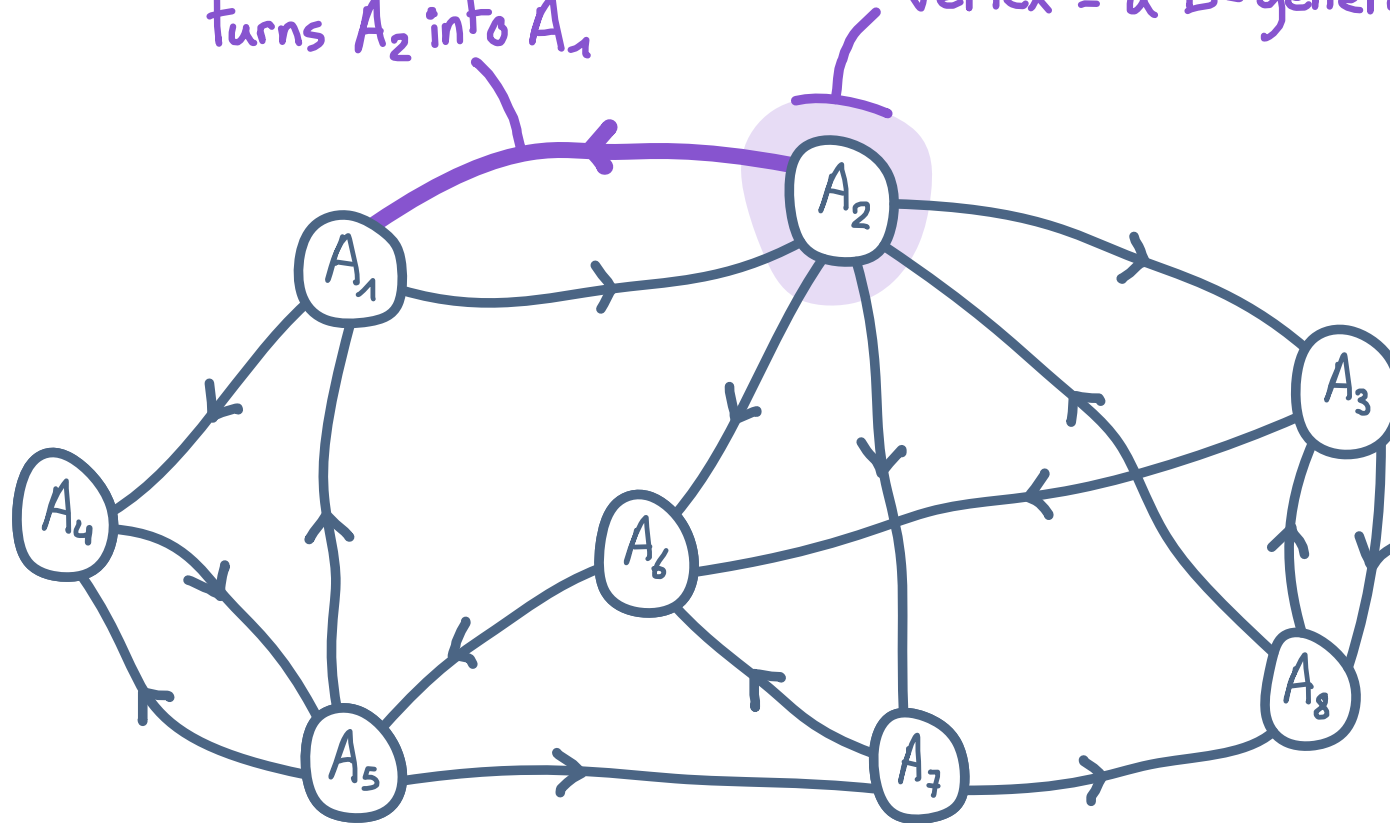
**PROB :** given an implicational base  $\Sigma$  over  $X$ ,  
find the D-base  $\Sigma_D$



Principle: Solution - graph traversal

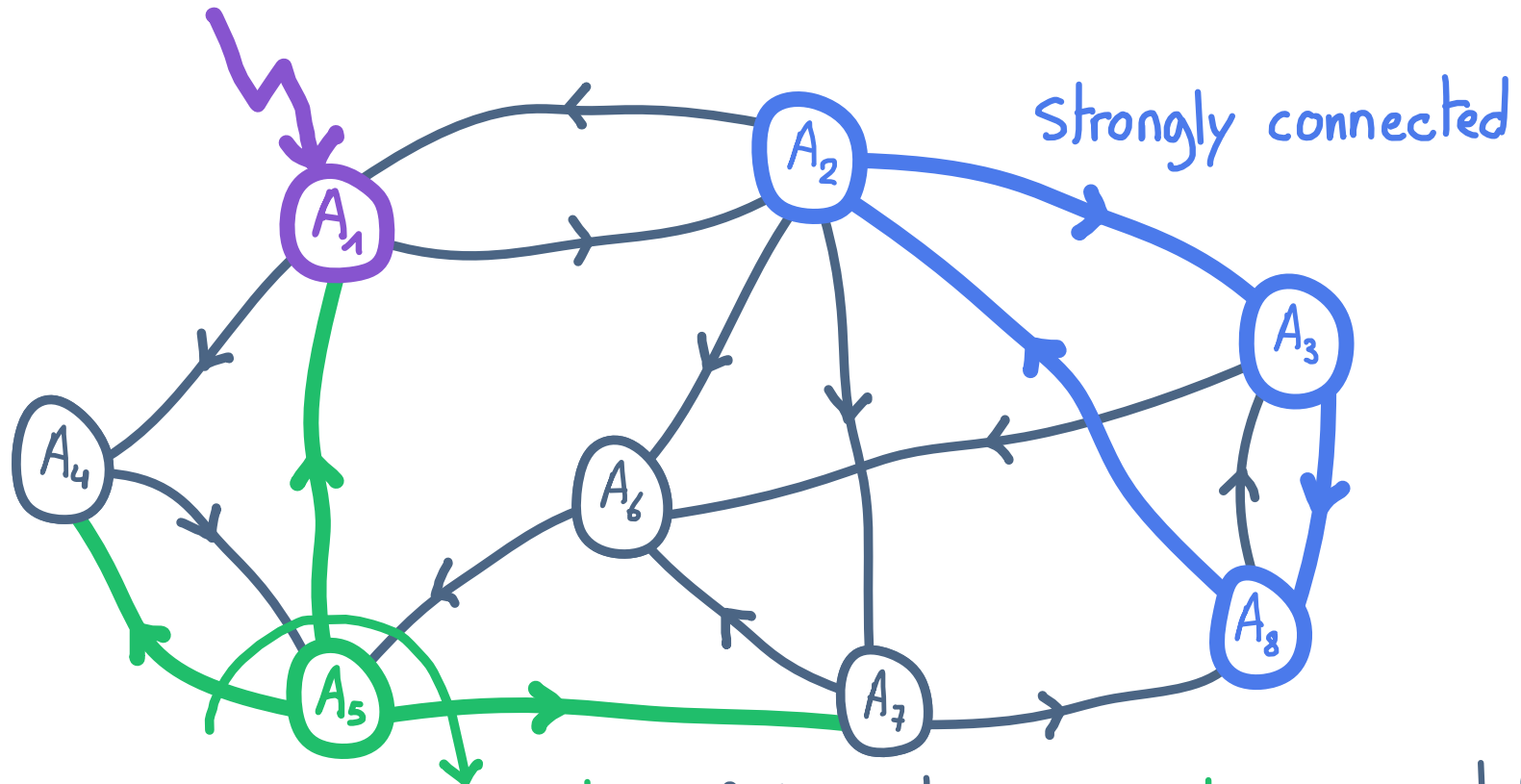
arc = transition\* which  
turns  $A_2$  into  $A_1$

vertex = a D-generator of  $x$



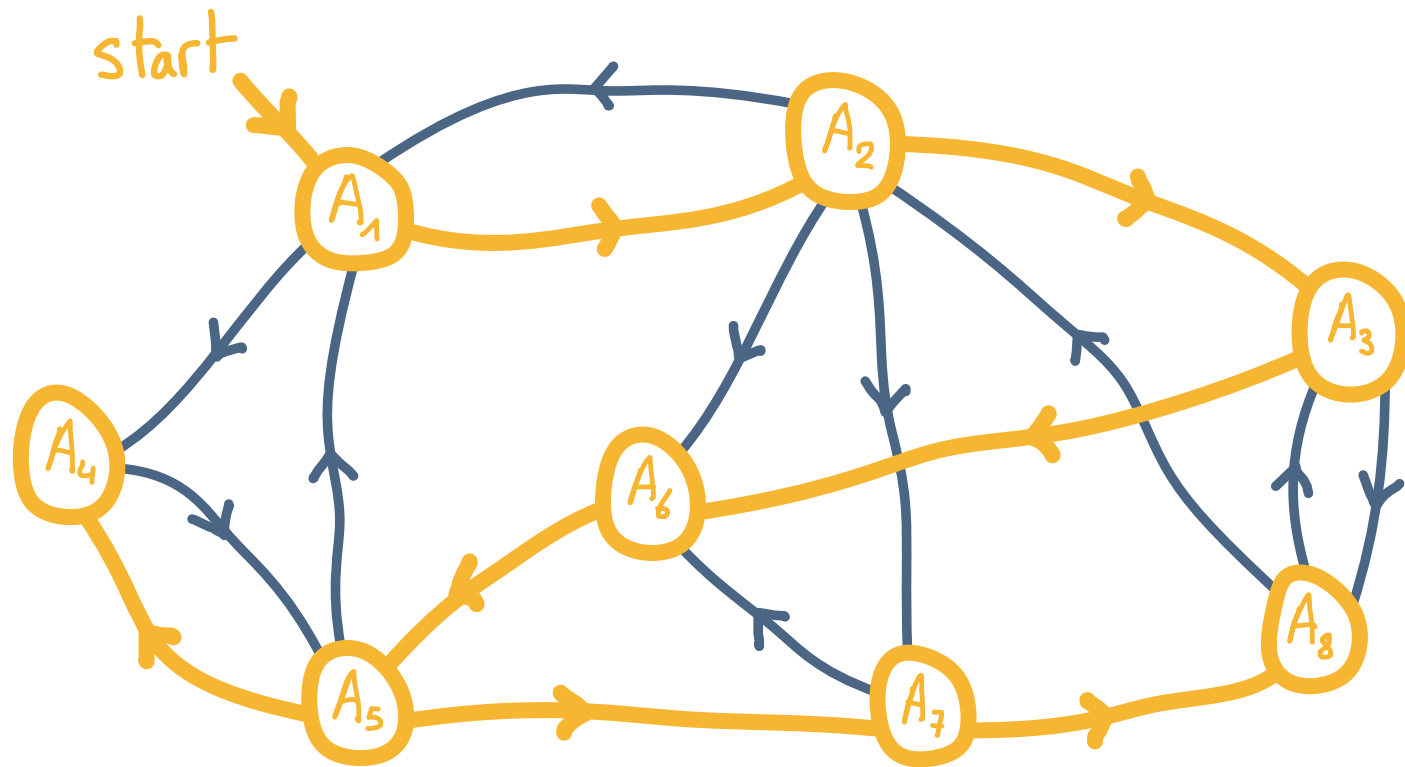
\* transition key idea: substitute  $a_2 \in A_2$  with  $B$  s.t.  $B \rightarrow a_2 \in \Sigma$   
(greedily) minimize w.r.t.  $\Sigma^b$

Principle: Solution - graph traversal



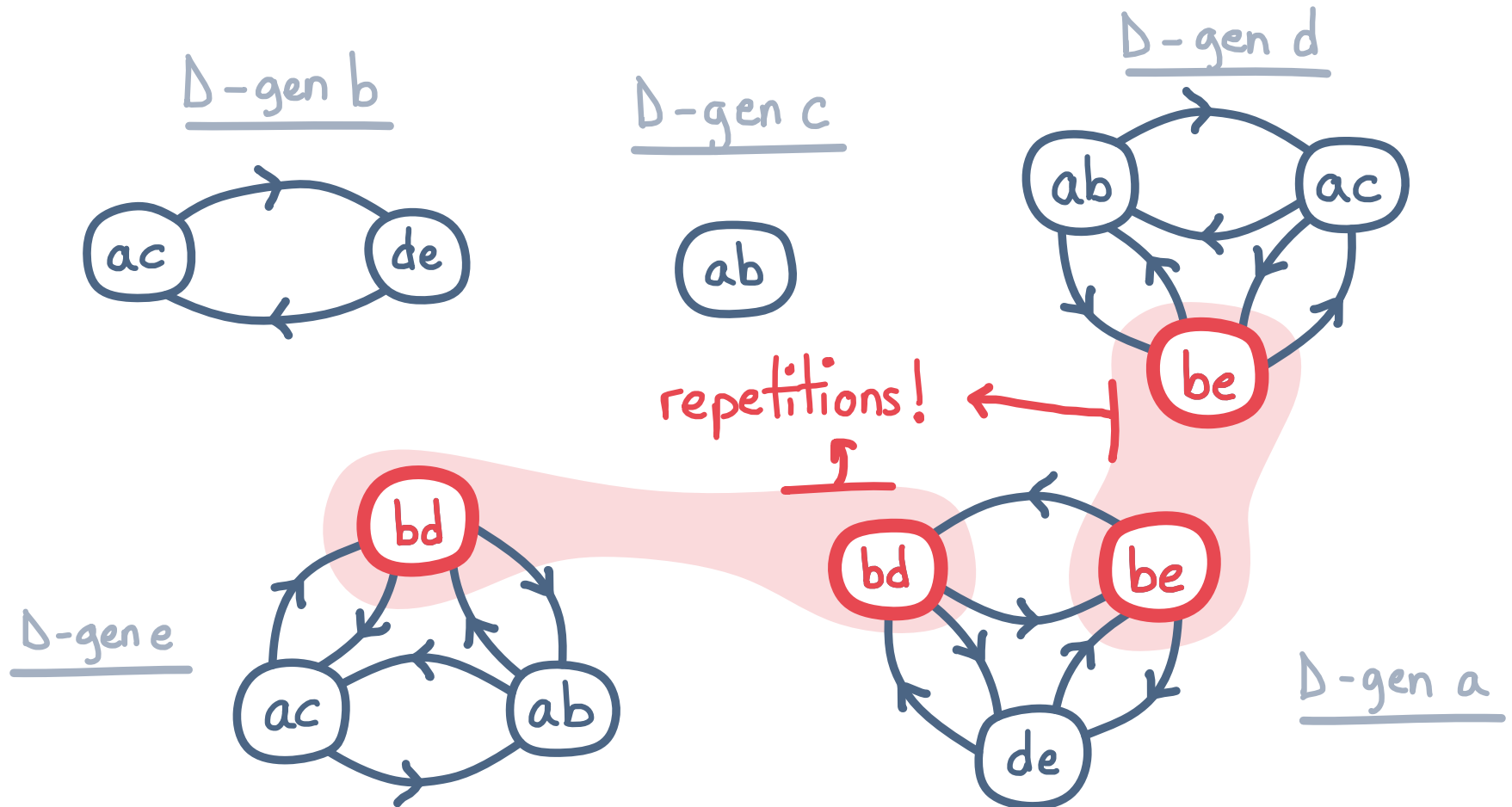
1st solution in poly-time + poly transitions + strongly connected

Principle: Solution - graph traversal



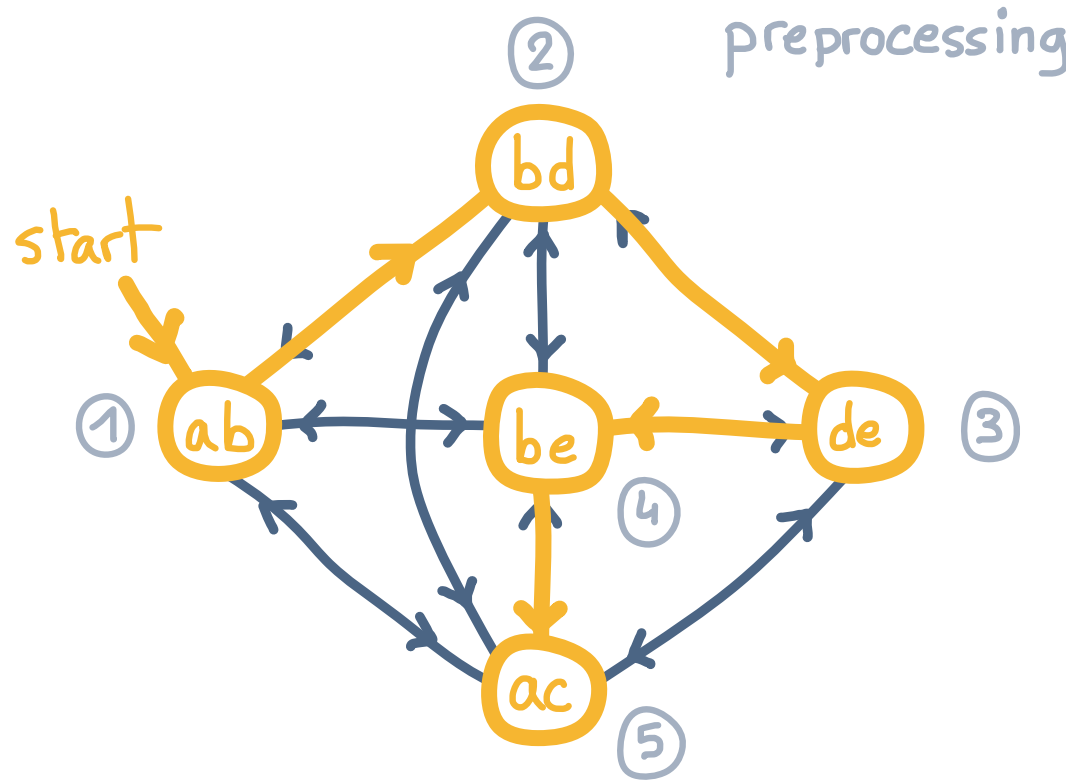
1st solution in poly-time + poly transitions + strongly connected  
⇒ poly-delay enumeration (with DFS) of D-gen of some  $x$

In our case (running ex)



**PROB:** applying algo on each  $x \in X$  yields repetitions  
⇒ no guarantee on delay

Fix: merge the graphs



⑤  $d \rightarrow c, e \rightarrow c$

①  $ab \rightarrow c, ab \rightarrow d, ab \rightarrow e$

②  $bd \rightarrow a, bd \rightarrow e$

③  $de \rightarrow a, de \rightarrow b$

④  $be \rightarrow a, be \rightarrow d$

⑤  $ac \rightarrow b, ac \rightarrow d, ac \rightarrow e$

**FIX:** take the union of supergraphs

- poly transitions
- 1st solution in poly-time  $\forall x \in X$
- strongly connected components

$\Rightarrow$  poly delay enumeration of all D-gens (with DFSs)

**PROB :** given an implicational base  $\Sigma$  over  $X$ ,  
find the D-base  $\Sigma_D$

Solution graph traversal  
+ Ennaoui, Nourine 16

**THM :** given  $\Sigma$  over  $X$ ,  $\Sigma_D$  can be computed  
with polynomial delay

ANY, 24+

Dilworth

Lattices with unique irreducible decompositions  
Annals of Mathematics, 1940

Finkbeiner

A general dependence relation for lattices  
Proceedings of the AMS, 1951

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A report on sublattices of a free lattice  
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Free lattices

Survey and Monograph of the AMS, 1995

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The multiple facets of the canonical direct unit implicational basis

Theoretical Computer Science, 2010

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