

The Complexity of Constraint Problems

I

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OUTLINE OF PART 1

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CSP = Constraint Satisfaction Problem

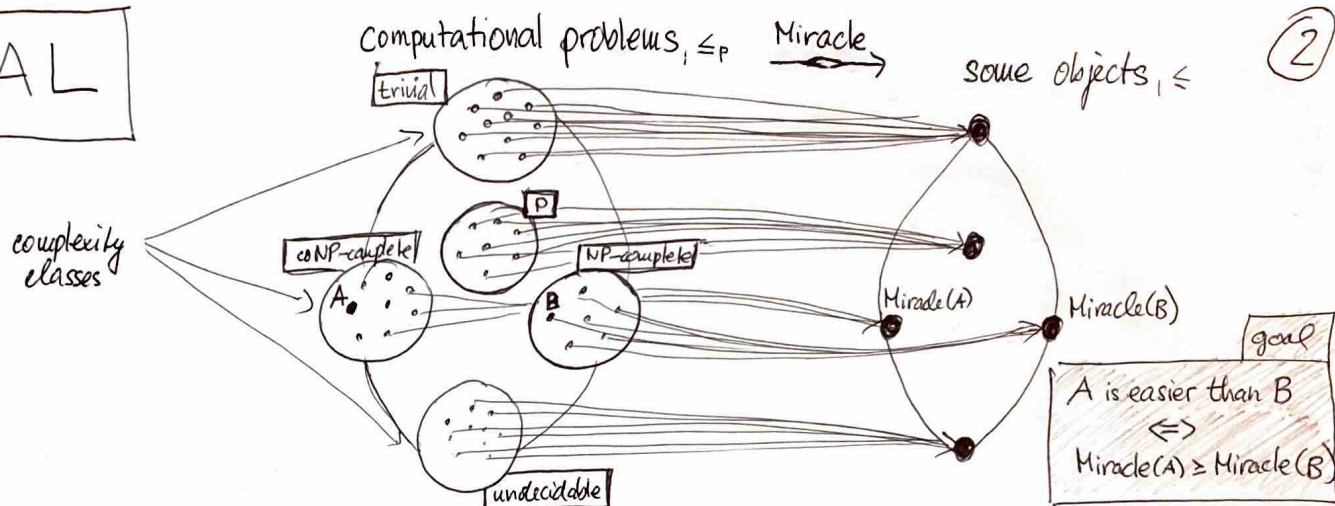
Find values for variables so that given constraints are satisfied

Question: What is the computational complexity?

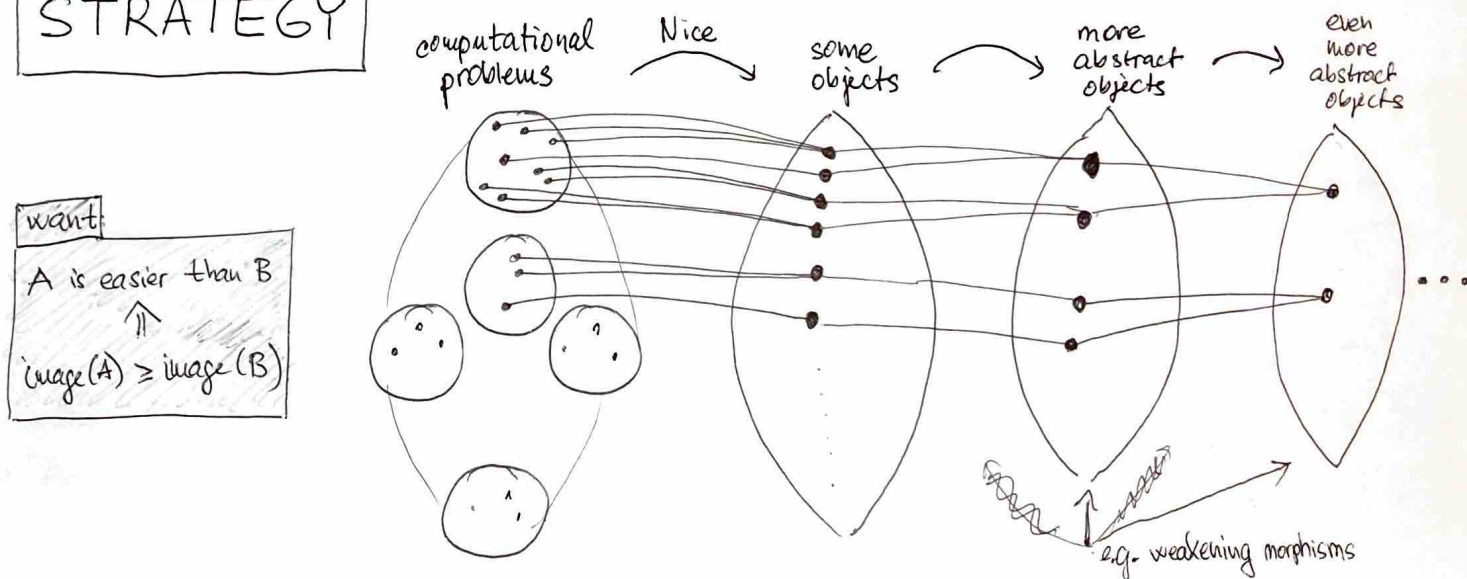
- Ideal world of computational complexity
- Why am I looking at CSP (despite disliking CS)?
- Problems CSP(A)
- Why am I here?
- Story about logic & CSP

Ideal world
of
computational
complexity

GOAL



STRATEGY

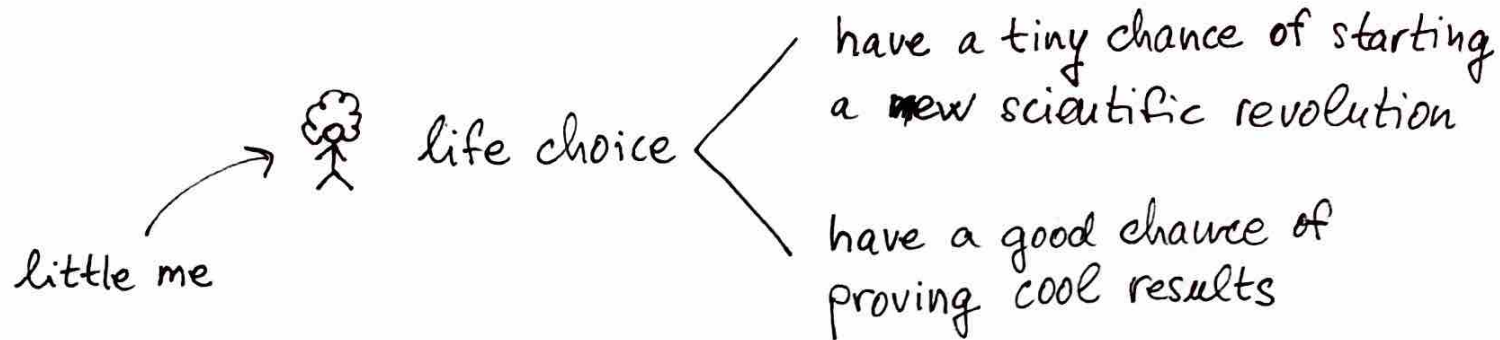


- Problems
- Why am I here?
- Story about logic & CSP

Why am I
looking at CSPs?

I'M NAÏVE

my choice
↓
✓



- computational complexity (even basic questions like $P=NP?$) seems to require substantially new math
- very popular: composing unary functions (permutation groups, groups, monoids, ...)
not so popular: —||— multivariable functions (clones, minions)
- math is too linear-algebraic

CSP

Problems CSP(A)

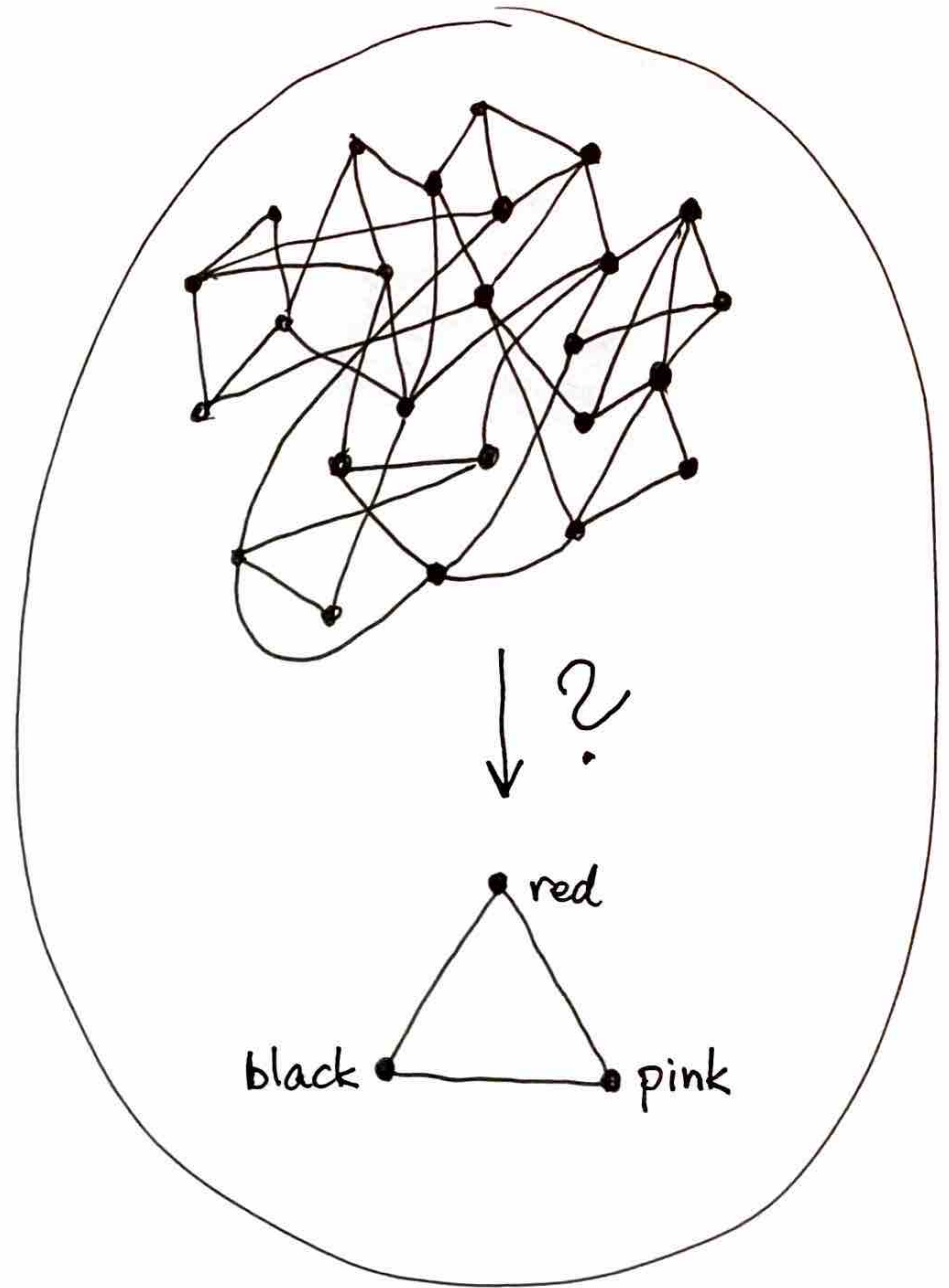
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3-coloring problem

INPUT: graph G

OUTPUT: $G \rightarrow \triangle$
(if it exists)

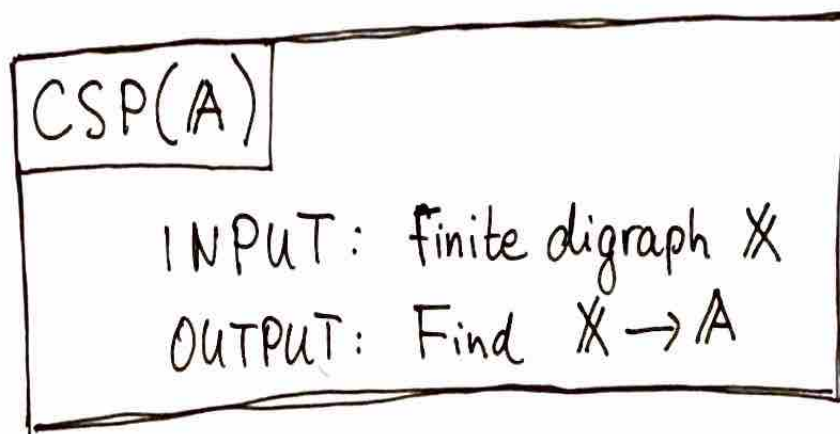
Question: how fast can it
be solved?



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CSP

A : fixed digraph (or other structure)



• the fixed-template CSP

• many variants

• each $A \rightsquigarrow$ computational problem

• how broad is this class?

• general A : all computational problems

• finite A : 3-coloring () , 3-SAT, $LIN-Z_2$

always in NP

Why am I here?

3 REASONS

- broadening horizons
- established connections model theory $\leftrightarrow$ ω -domain CSP
- ! more recent connections set theory $\leftrightarrow$ finite domain CSP

THEOREM (ZF) [de Bruijn, Erdős '51, Löwenheim '71, Kötter, Tóth, Vidnyánszky '24, Tardiff]

For finite A

- CSP(A) solved by arc-consistency $\Rightarrow$ Comp(A) true
- not $\uparrow \Rightarrow$ Comp(A) implies $\exists S \subseteq \mathbb{R}^3$ non-measurable
- CSP(A) in P $\Rightarrow$ Comp(A) doesn't imply ultrafilter axiom
- not $\uparrow$ (P $\neq$ NP) $\Rightarrow$ Comp(A) implies — " —

it's not a coincidence (some CSP results needed)

THEOREM [Todorćević, Vidnyánszky '21, Grebik, Vidnyánszky, Thornton '22]

For finite A

- CSP(A) "very easy" $\Rightarrow$ Borel CSP(A) easy
- CSP(A) solved by local consistency $\stackrel{?}{\Rightarrow}$ Borel CSP(A) hard

Comp(A)

$\forall X$

$\forall X' \subseteq_{\text{fin}} X \quad X' \rightarrow A$

$\Rightarrow \forall X \rightarrow A$

true assuming
ultrafilter axiom

COMP($\mathbb{K}_3$) $\Rightarrow$ ULTRAFILTER AXIOM

• $\mathcal{F}$ filter on X . Want $\mathcal{F} \subseteq \mathcal{U}$ ultrafilter

• graph G vertex set $\{0,1,2\}^X$
 $(a_x)_{x \in X} \text{ --- } (b_x)_{x \in X}$ iff $\{x \mid a_x \neq b_x\} \in \mathcal{F}$

① $\forall$ finite $G' \subseteq G$ is 3-colorable

$\Rightarrow \exists c: \{0,1,2\}^X \rightarrow \{0,1,2\}$ 3-coloring of G (For $\mathcal{F} = \{X\}$
 $= X$ -ary polymorphism of $\mathbb{K}_3$)

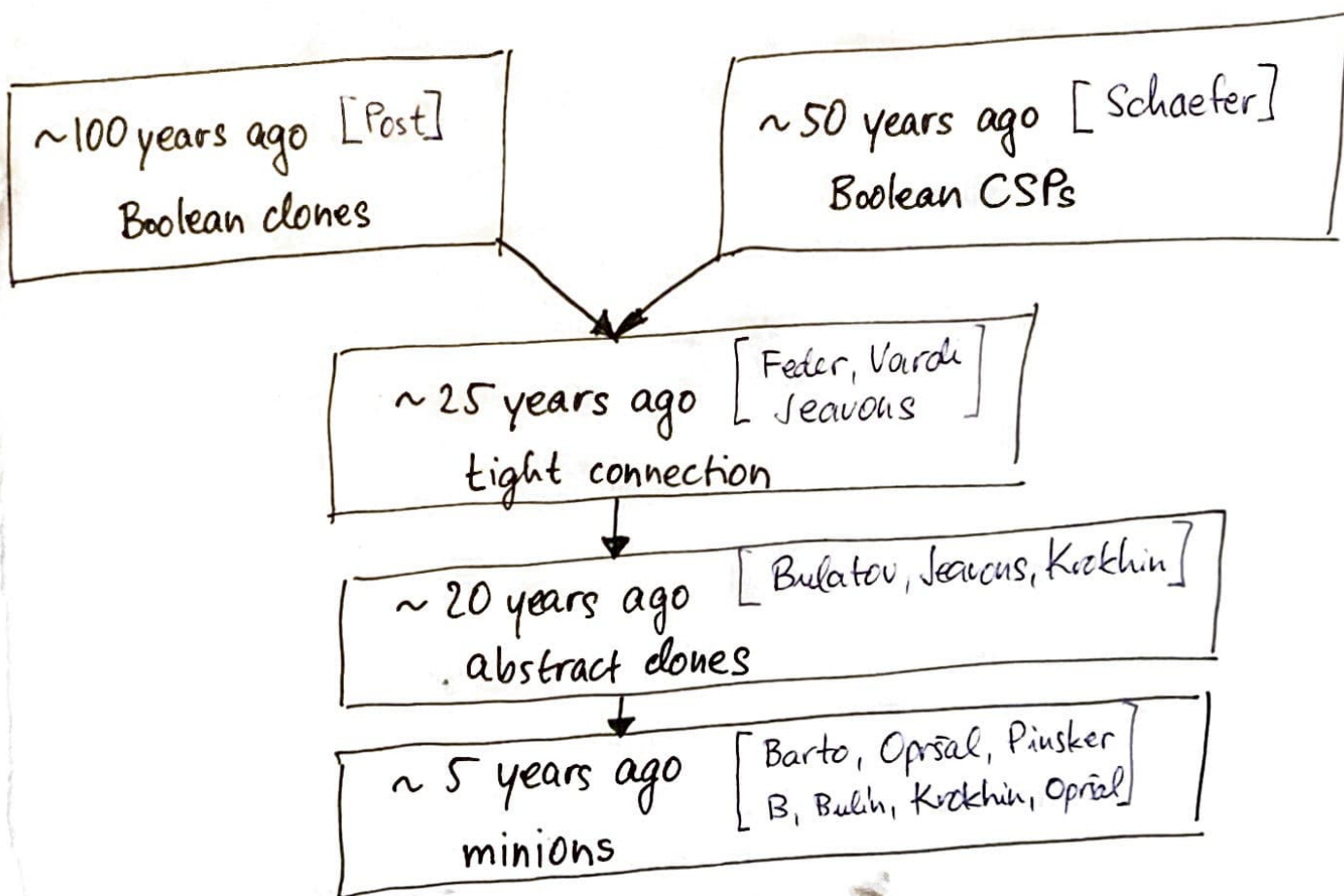
② WLOG $c(00\dots 0) = 0, c(11\dots 1) = 1, c(22\dots 2) = 2$

• $U \in \mathcal{U}$ iff $c(000\dots \underbrace{11111}_U \dots 00\dots 0) = 1$

Story about
logic & CSP

OUTLINE

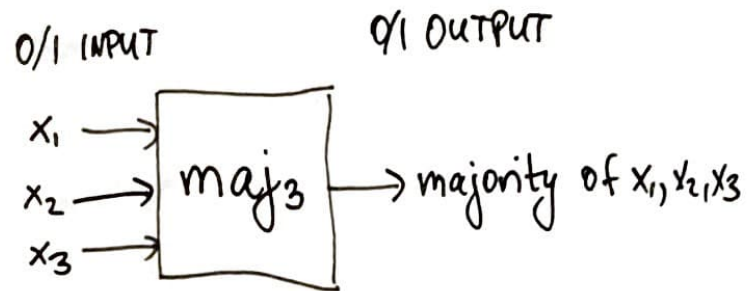
①



I. BOOLEAN CLONES : EXAMPLE

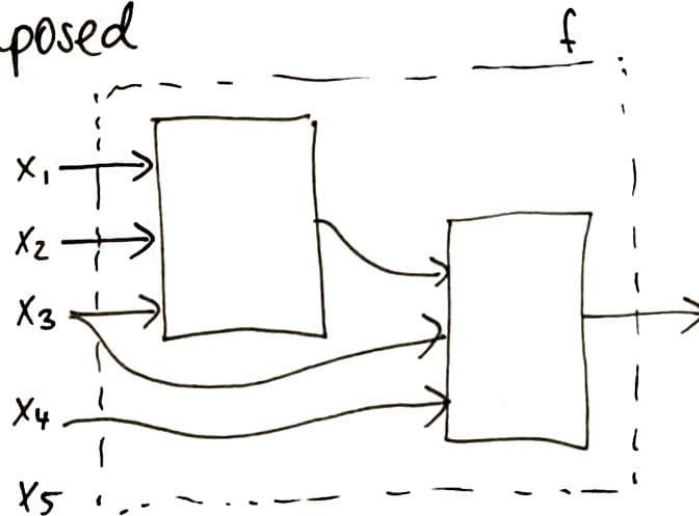
(2)

- consider



$$\{0, 1\}^3 \rightarrow \{0, 1\}$$

- can be composed

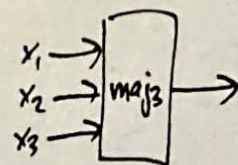
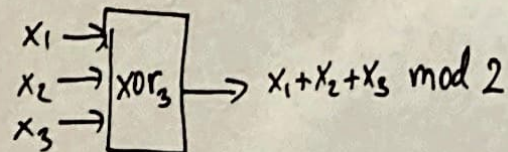
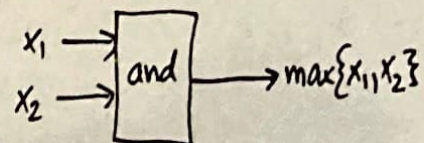


$$f(x_1, x_2, x_3, x_4, x_5) = \text{maj}_3(\text{maj}_3(x_1, x_2, x_3), x_3, x_4)$$

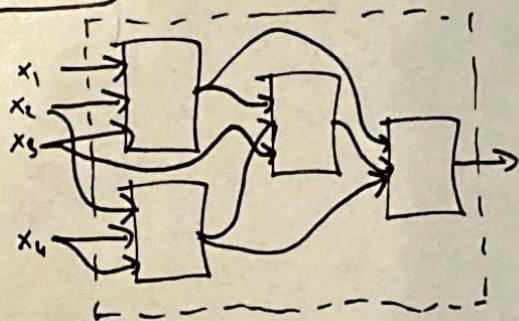
- Can you compose maj_7 from maj_3 ? (maj_{37} , $\text{maj}_{11234567}$?)
- what operations $\{0, 1\}^n \rightarrow \{0, 1\}$ can be composed from maj_3 ?

I. BOOLEAN CLONES : DEFINITIONS

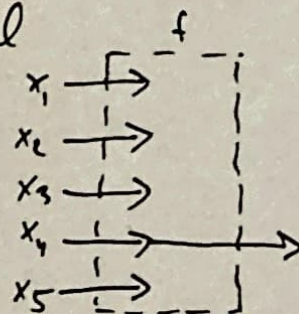
- **Boolean operation** $\{0,1\}^n \rightarrow \{0,1\}$
(think: logical connective)



- **Composition**



includes the trivial



$$f(x_1, x_2, x_3, x_4, x_5) = x_4$$

- **Boolean clone** set of Boolean operations closed under composition
- $\mathcal{F}$ set of Boolean operations

$\text{Clo}(\mathcal{F})$ = the smallest clone containing $\mathcal{F}$

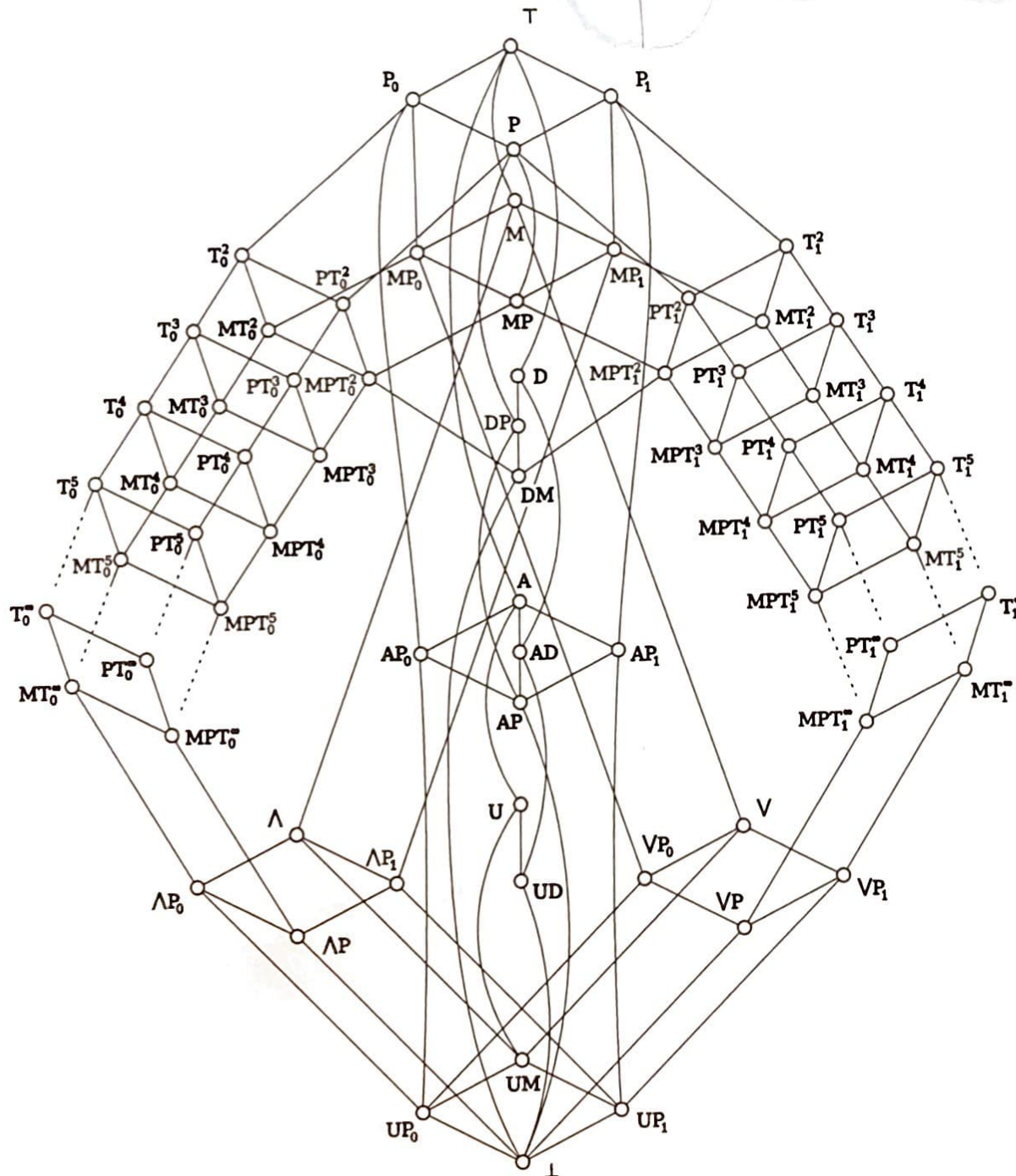
- $\text{Clo}(\mathcal{F}) = \text{Clo}(\mathcal{G}) \dots \mathcal{F}, \mathcal{G}$ equally expressive
- $\text{Clo}(\mathcal{F}) \subset \text{Clo}(\mathcal{G}) \dots \mathcal{G}$ more expressive than $\mathcal{F}$

last slide

- $\text{maj}_7 \in \text{Clo}(\{\text{maj}_3\})$?
- what is $\text{Clo}(\{\text{maj}_3\})$?

I. BOOLEAN CLONES - CLASSIFICATION

(4)



[Post '41 but...]

- poset
(Boolean clones, $\subseteq$)
- = poset
(sets of logical connectives,
 $\leq$ expressive power)
/ equal expressive power

I. GENERAL CLONES

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- Clone on a set A

set of operations on A ($A^n \rightarrow A$)
closed under composition

- Dream: classify all clones

More realistic: at least on $\{0,1,2\}$ ($2^{\aleph_0}$ many)

More realistic: prove at least something

- Motivation

- logic

- algebra (algebras $\underline{A}, \underline{B}$ have the same clone of term operations
 $\Rightarrow$ they are "the same" for most purposes)

- computational complexity...

I. BOOLEAN CSPs

Constraint Satisfaction Problems

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- Boolean relation $R \subseteq \{0,1\}^n$
- Given Γ ... set of Boolean relations

CSP(Γ)

INPUT: pp-sentence over Γ
 $\uparrow$ only $\exists, \wedge, R \in \Gamma$ allowed

OUTPUT: true?

$$R = \{0,1\}^2 \setminus \{(0,0)\} \quad R(x,y) \equiv x \vee y$$
$$S = \{0,1\}^3 \setminus \{(1,0,0)\} \quad S(x,y,z) \equiv \neg x \vee y \vee z$$

$$\Gamma = \{R, S\}$$

$$\exists x,y,z,u \quad R(x,y) \wedge S(z,x,u) \wedge R(x,u)$$

$$\text{YES} \quad x,y,z,u \mapsto 1$$

- Examples: 2-SAT, HORN-SAT, 3-SAT, 3-COLORING, LINEAR EQ. OVER $GF(2)$
- THEOREM [Schaefer '78] $\forall \Gamma \quad \text{CSP}(\Gamma) <_{\text{NP-complete}}^{\text{in P}}$
- Main tool: Γ pp-definable from $\Delta \Rightarrow \text{CSP}(\Gamma) \leq \text{CSP}(\Delta)$

I. CLONES $\leftrightarrow$ CSPs : HISTORY

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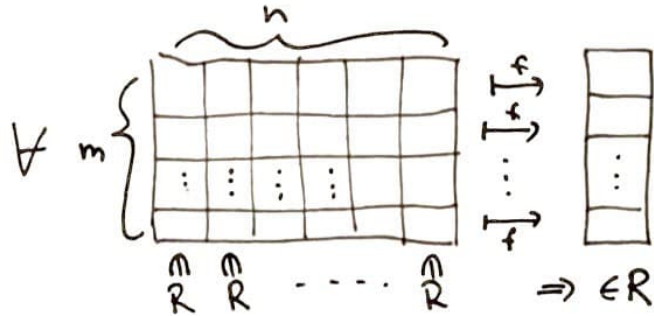
- [Schaefer'78] Post did something about Boolean operations seems unrelated...
- [Feder, Vardi'98] Complexity of $\text{CSP}(\Gamma)$ seems related to "closure properties" of relations in Γ
- [Jeavons'00] Complexity of $\text{CSP}(\Gamma)$ IS related to — " — (by a result from 60s) $\leadsto$ clones
- [universal algebraists]

LET'S GO !!!

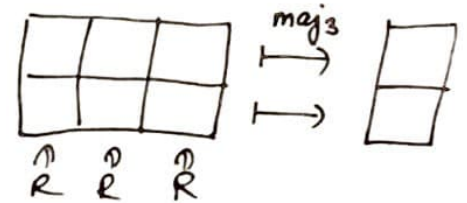
I. CLONES $\leftrightarrow$ CSPs : POLYMORPHISMS

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- $f: \{0,1\}^n \rightarrow \{0,1\}$ is a polymorphism of $R \subseteq \{0,1\}^m$ if



maj_3 is a polymorphism of every $R \subseteq \{0,1\}^2$



- Γ ... set of Boolean relations

$\text{Pol}(\Gamma)$... polymorphisms of every $R \in \Gamma$. Clone

$$\text{Pol}(\text{all binary}) = \text{Clo}(\text{maj}_3)$$

- THEOREM [Geiger'68, Bodnarchuk, Kaluzhnin, Kotov, Romov'69]

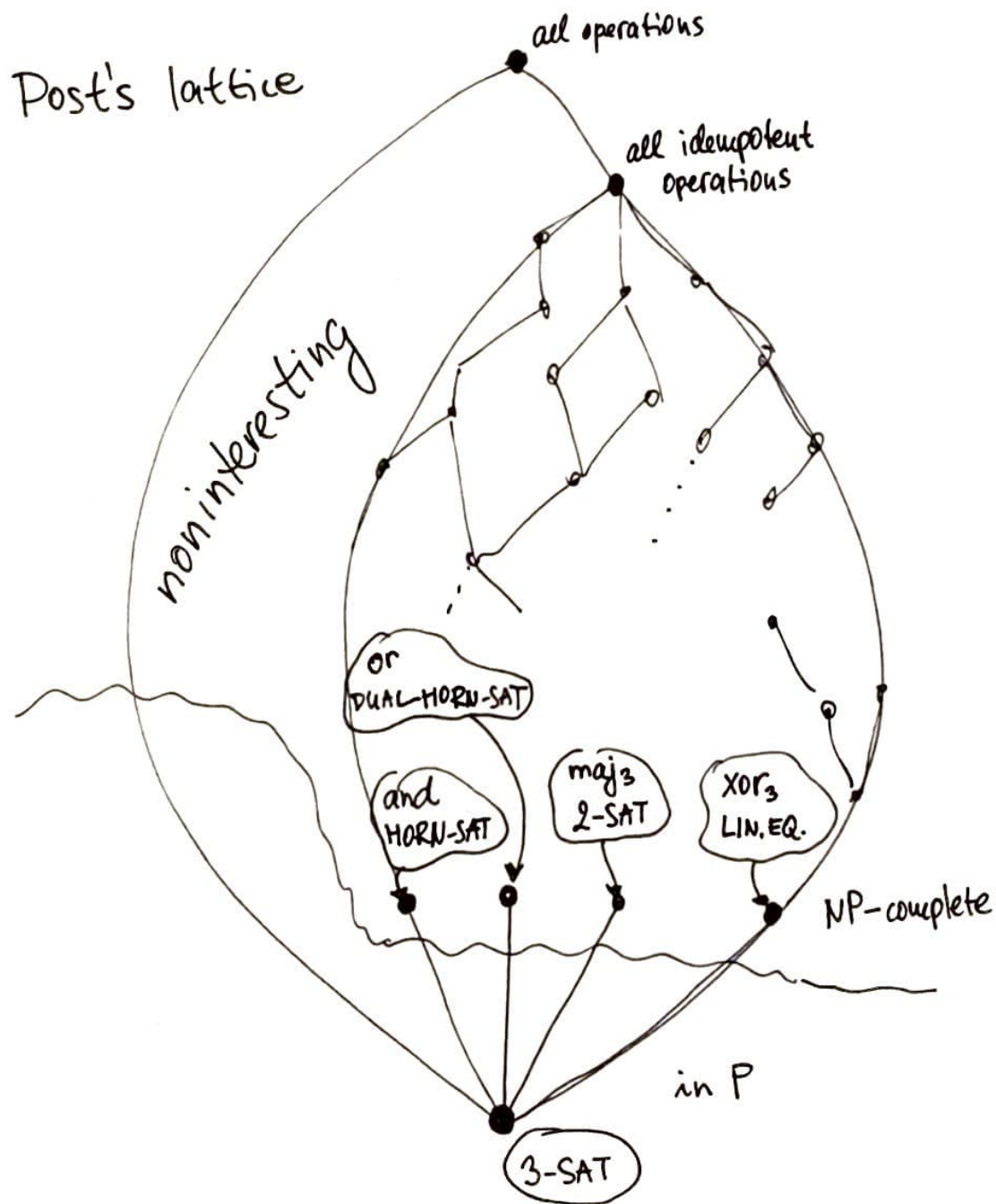
$$\Gamma \text{ pp-definable from } \Delta \iff \text{Pol}(\Gamma) \supseteq \text{Pol}(\Delta)$$

(and then $\text{CSP}(\Gamma) \leq \text{CSP}(\Delta)$)
[Schaefer]

not only Boolean
...any finite A

I. CLONES $\leftrightarrow$ CSPs: SCHAEFER REVISITED

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- 60s theorem implies
 $\text{Pol}(\Gamma)$ higher
 $\Rightarrow \text{CSP}(\Gamma)$ easier
- restrict to "interesting clones"
 = idempotent, i.e. $\forall a f(a, \dots, a) = a$
- 4 minimal clones by Post
 - $\text{Clo}(\text{and})$
 - $\text{Clo}(\text{or})$
 - $\text{Clo}(\text{maj}_3)$
 - $\text{Clo}(\text{xor}_3)$
- they correspond to CSPs in P
 $\Rightarrow$ Schaefer

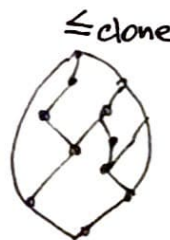
I. NEW ORDERS

- 2 problems beyond Boolean
 - classification hard even for clones on $\{0,1,2\}$
 - for CSPs: borderline is not at the bottom

- "better preorders" $\mathcal{C} \subseteq \mathcal{D} \Rightarrow \mathcal{C} \leq_{\text{clone}} \mathcal{D} \Rightarrow \mathcal{C} \leq_{\text{minion}} \mathcal{D}$

$\rightsquigarrow$ "simpler" posets

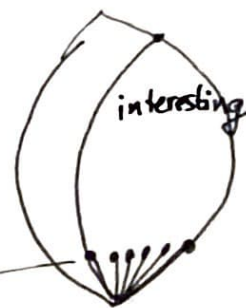
still good for CSPs



$\rightsquigarrow$ "simpler" objects than clones

(here "simpler" = carries less information)

clones on $\{0,1,2\}$



some of them
NP-complete

I. NEW ORDERS: DETAILS

my life

- ① minions
- ② algebras, clones, CSPs
- ③ minions

11

$CSP(\Gamma) \leq CSP(\Delta)$ if

relationally	Γ pp-definable from Δ	Γ pp-interpretable in Δ	Γ pp-constructible from Δ
algebraically	$Pol(\Delta) \subseteq Pol(\Gamma)$	$\exists Pol(\Delta) \rightarrow Pol(\Gamma)$ <u>clone homomorphism</u> ↑ preserves arities & composition	$\exists Pol(\Delta) \rightarrow Pol(\Gamma)$ <u>minion homomorphism</u> ↑ preserves arities & permutation, identification of variables
preorder on clones	$\mathcal{C} \subseteq \mathcal{D}$	$\mathcal{C} \leq_{clone} \mathcal{D}$ if $\exists clone \text{ homo } \mathcal{C} \rightarrow \mathcal{D}$	$\mathcal{C} \leq_{minion} \mathcal{D}$ if $\exists minion \text{ homo } \mathcal{C} \rightarrow \mathcal{D}$
algebraic object	clone [Geiger'68; Bodnarchuk, Kaluzhchin, Kotov, Romanov'69 Jeavons'00]	abstract clone [Birkhoff'35 Bulatov, Jeavons, Krokhin'05 Bodirsky'08]	<u>minion</u> ↑ functor finite ordinals $\rightarrow$ sets [B, Opršal, Pinsker'18 B, Bulín, Krokhin, Opršal'21]

* see my life

I. NEW ORDERS: GAINS

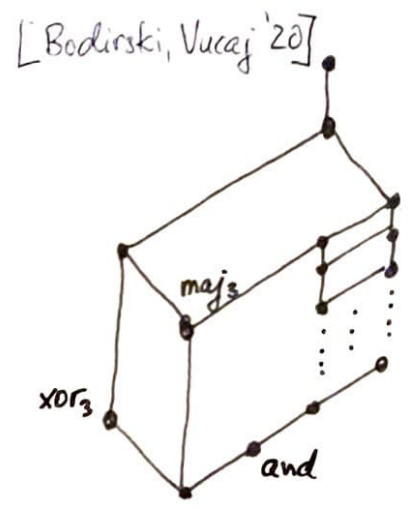
- Boolean clones get simpler



$\subseteq$



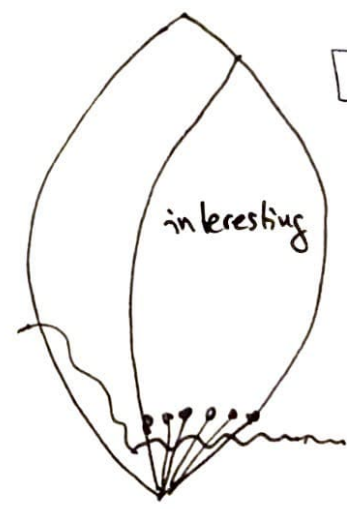
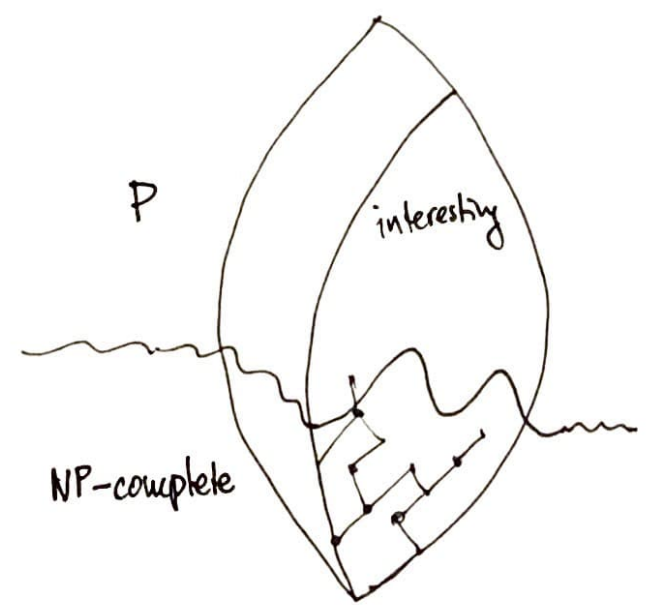
$\leq_{\text{clone}}$



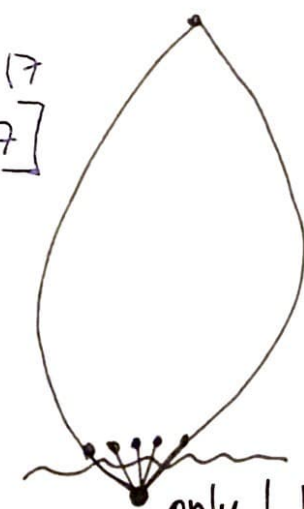
$\leq_{\text{minion}}$

[Bodirski, Vucelj '20]

- new hope for $\{0,1,2\}$ (Zhuk) or even bigger, e.g. possibly countable!
- beautiful borderlines for CSPs



in P by
[Bulatov'17
Zhuk'17]



only 1 NP-complete!

III. WRAP UP

- clones $\rightarrow$ abstract clones $\rightarrow$ (abstract) minions $\rightarrow$?
- minions important for Promise CSPs
e.g. 6-color a 3-colorable graph
- math: very infinite, infinite, finite, very finite
active & cool part of logic & algebra
- object $G \rightarrow \text{Aut}(G)$ group: symmetries of G
 $G \rightarrow \text{Pol}(G)$ clone: multivariate symmetries of G
 - useful in CSPs
 - will it become a standard concept in math?

Thank you
for listening!