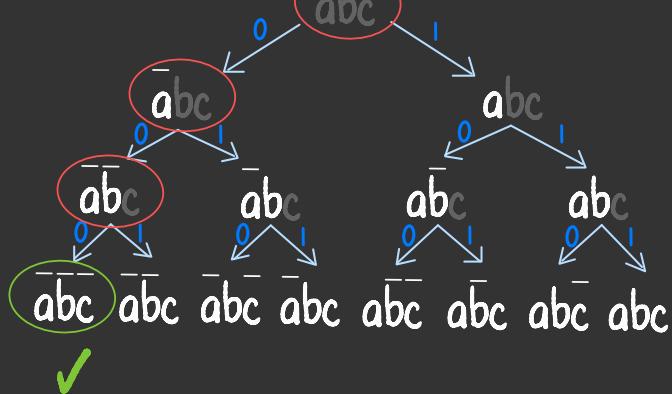


dpll

CSCI
373

Search-based



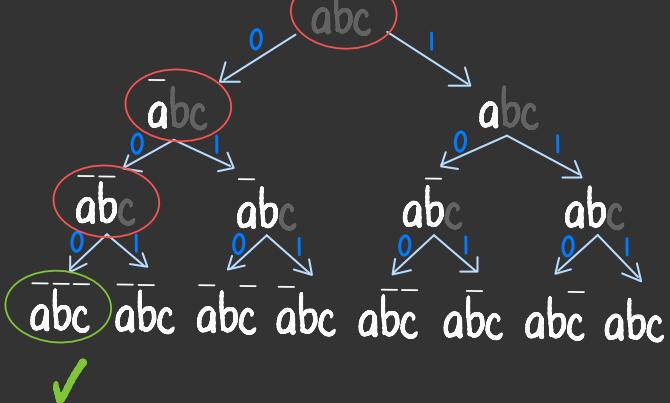
resolution-based

original sentence	$A \vee \neg B \vee D$ $B \vee C$ $\neg D$ $A \vee C \vee D$
resolution closure	$A \vee \neg B$ $A \vee C$

is \perp
in the
resolution
closure
?

two satisfiability solvers

Search-based



terminates early if it finds a satisfying model
(only for satisfiable sentences)

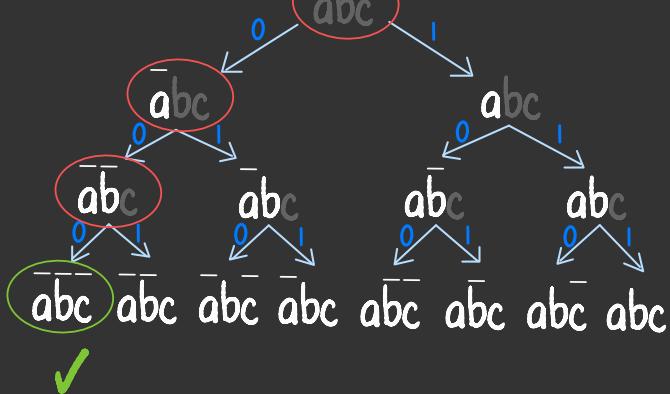
resolution-based

original sentence	$A \vee \neg B \vee D$ $B \vee C$ $\neg D$ $A \vee C \vee D$
resolution closure	$A \vee \neg B$ $A \vee C$

is \perp
in the resolution closure
?

terminates early if it entails \perp
(only for unsatisfiable sentences)

Search-based



resolution-based

original sentence	$A \vee \neg B \vee D$ $B \vee C$ $\neg D$ $A \vee C \vee D$
resolution closure	$A \vee \neg B$ $A \vee C$

is in
in the
resolution
closure

?

Can we combine these approaches?

could we use
resolution here?



find Satisfying Model (α):

- ▶ container = new stack()
- ▶ container.put ({})
- ▶ repeat:
 - ▶ if container.empty() then return "unsatisfiable"
 - ▶ m = container.get()
 - ▶ if $m \in I(\alpha)$ then return m
 - ▶ if $\alpha \wedge \text{term}(m)$ is unsatisfiable:
 - ▶ do nothing
 - else:
 - ▶ for $m' \in \text{successors}(m)$:
container.put(m')

could we use
resolution here?



find Satisfying Model (α):

- ▶ container = new stack()
- ▶ container.put({})
- ▶ repeat:
 - ▶ if container.empty() then return "unsatisfiable"
 - ▶ m = container.get()
 - ▶ if $m \in I(\alpha)$ then return m
 - ▶ if $\perp \in RC(\alpha \wedge \text{term}(m))$:
 - ▶ do nothing
 - else:
 - ▶ for $m' \in \text{successors}(m)$:
container.put(m')

what is the resolution closure?

$\neg A \vee B \vee C$

$B \vee C \vee D \vee E$

$A \vee D \vee E$

$\neg A \vee C \vee \neg F$

$C \vee D \vee E \vee \neg F$

$A \vee \neg D \vee G$

$A \vee E \vee G$

$C \vee \neg D \vee \neg F \cdot \neg G$

what is the resolution closure?

$\neg A \vee B \vee C$

$A \vee D \vee E$

$\neg A \vee C \vee \neg F$

$A \vee \neg D \vee G$

$B \vee C \vee D \vee E$

$B \vee C \vee \neg D \vee G$

$C \vee D \vee E \vee \neg F$

$C \vee \neg D \vee \neg F \vee G$

$B \vee C \vee E \vee \neg F \vee G$

$A \vee B \vee C \vee E \vee G$

etc.

even starting with only 4 clauses of length 3,
the resolution closure can grow large

$$\neg A \vee B \vee C$$

$$A \vee D \vee E$$

$$\neg A \vee C \vee \neg F$$

$$A \vee \neg D \vee G$$

$$B \vee C \vee D \vee E$$

$$B \vee C \vee \neg D \vee G$$

$$C \vee D \vee E \vee \neg F$$

$$C \vee \neg D \vee \neg F \vee G$$

$$B \vee C \vee E \vee \neg F \vee G$$

$$A \vee B \vee C \vee E \vee G$$

etc.

in practice,
this check is
too expensive

find Satisfying Model (α):

- ▶ container = new stack()
- ▶ container.put({})
- ▶ repeat:
 - ▶ if container.empty() then return "unsatisfiable"
 - ▶ m = container.get()
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 - ▶ if $\perp \in RC(\alpha \wedge \text{term}(m))$:
 - ▶ do nothing
 - else:
 - ▶ for $m' \in \text{successors}(m)$:
container.put(m')

recall:

the unsatisfiability test
needs to be sound,
but it does not
have to be complete

find Satisfying Model (α):

- ▶ container = new stack()
- ▶ container.put({})
- ▶ repeat:
 - ▶ if container.empty() then return "unsatisfiable"
 - ▶ $m = \text{container.get}()$
 - ▶ if $m \in I(\alpha)$ then return m
 - ▶ if $\alpha \wedge \text{term}(m)$ is unsatisfiable:
 - ▶ do nothing
 - else:
 - ▶ for $m' \in \text{successors}(m)$:
 container.put(m')

$$\neg A \vee B \vee \neg C$$

one way to save time:

$$A \vee D$$

only perform resolution

$$\neg A \vee C \vee \neg F$$

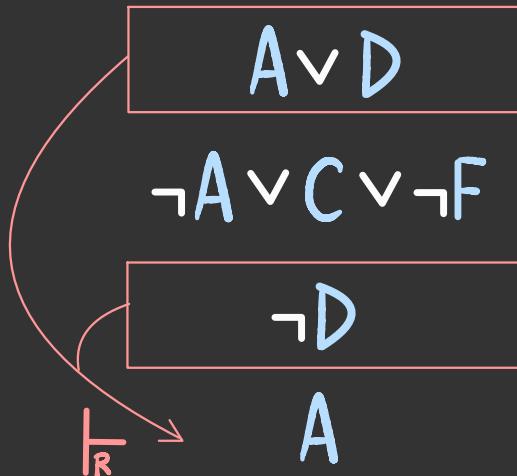
if one of the clauses

$$\neg D$$

has length 1

$$\neg A \vee B \vee \neg C$$

one way to save time:
only perform resolution
if one of the clauses
has length 1



one way to save time:
only perform resolution
if one of the clauses
has length 1

$$\neg A \vee B \vee \neg C$$

$$A \vee D$$

$$\neg A \vee C \vee \neg F$$

$$\neg D$$

$$A$$

$$\neg B \rightarrow B \vee \neg C$$

$$\neg A \vee B \vee \neg C$$

one way to save time:
only perform resolution
if one of the clauses
has length 1

$$A \vee D$$

$$\neg A \vee C \vee \neg F$$

$$\neg D$$

$$A$$

$$B \vee \neg C$$

\vdash_R

$$C \vee \neg F$$

this is called
unit resolution

original
sentence

$$\neg A \vee B \vee \neg C$$

$$A \vee D$$

$$\neg A \vee C \vee \neg F$$

$$\neg D$$

$$A$$

unit resolution
closure

$$B \vee C$$

$$C \vee \neg F$$

Computing the unit resolution closure turns out to be an effective strategy for pruning the search tree

find Satisfying Model (α):

- ▶ container = new stack()
- ▶ container.put({})
- ▶ repeat:
 - ▶ if container.empty() then return "unsatisfiable"
 - ▶ m = container.get()
 - ▶ if $m \in I(\alpha)$ then return m
 - ▶ if $\perp \in URC(\alpha \wedge \text{term}(m))$:
 - ▶ do nothing
 - else:
 - ▶ for $m' \in \text{successors}(m)$:
container.put(m')

dpll(α):

- ▶ container = new stack()
- ▶ container.put({})
- ▶ repeat:
 - ▶ if container.empty() then return "unsatisfiable"
 - ▶ $m = \text{container.get}()$
 - ▶ if $m \in I(\alpha)$ then return m
 - ▶ if $\perp \in URC(\alpha \wedge \text{term}(m))$:
 - ▶ do nothing
 - else:
 - ▶ for $m' \in \text{successors}(m)$:
 container.put(m')

the resulting
algorithm is
called DPLL

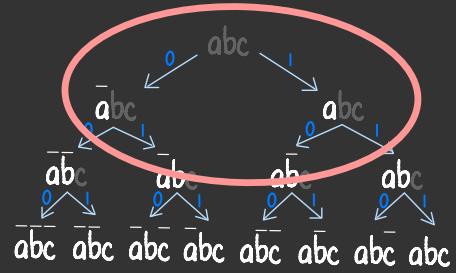
$\neg A$

$$\begin{array}{l} \neg A \vee B \vee \neg C \\ A \vee D \\ \neg A \vee B \vee D \\ C \vee \neg D \end{array}$$

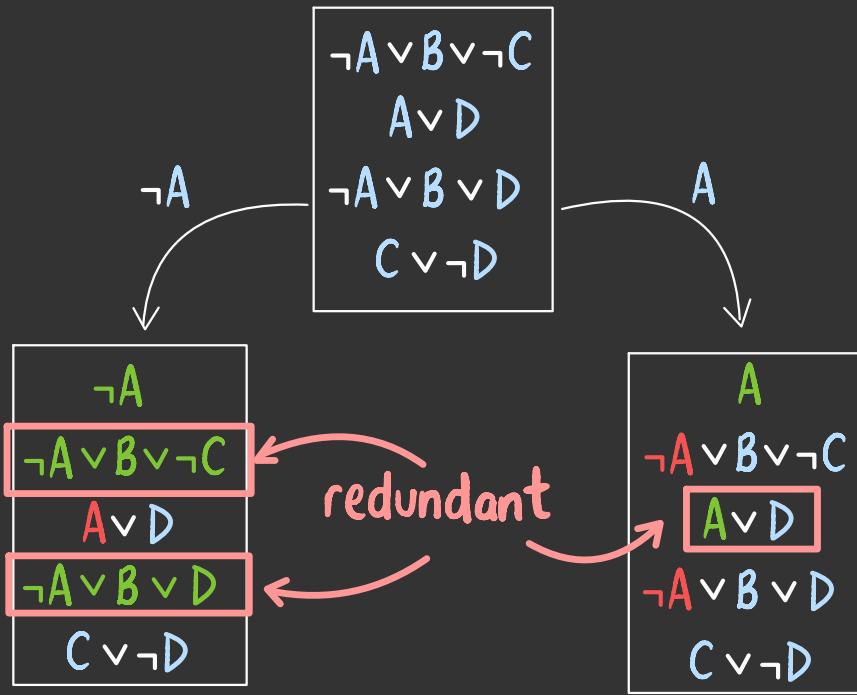
 A

$$\begin{array}{l} A \\ \neg A \vee B \vee \neg C \\ A \vee D \\ \neg A \vee B \vee D \\ C \vee \neg D \end{array}$$

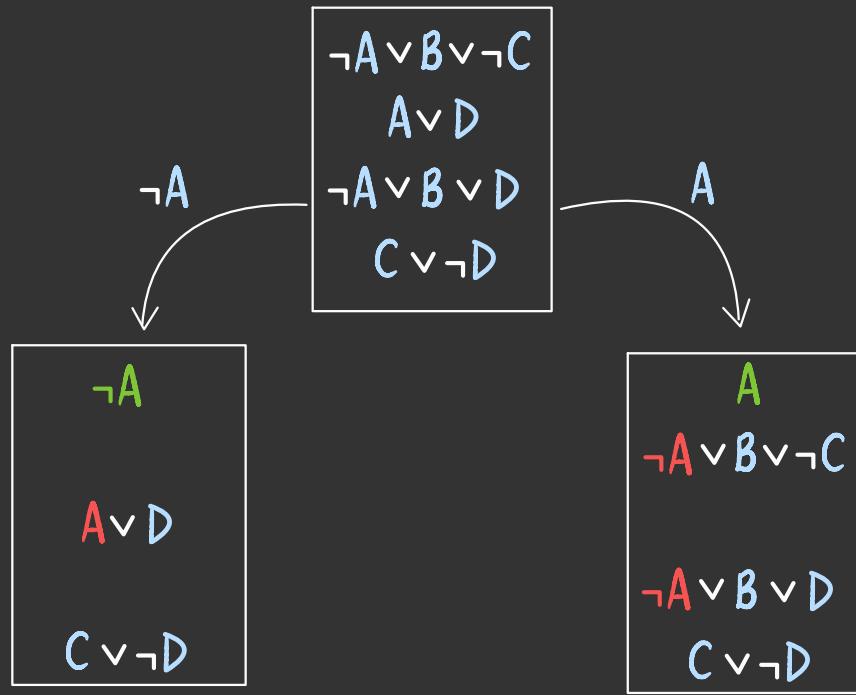
$$\begin{array}{l} \neg A \\ \neg A \vee B \vee \neg C \\ A \vee D \\ \neg A \vee B \vee D \\ C \vee \neg D \end{array}$$



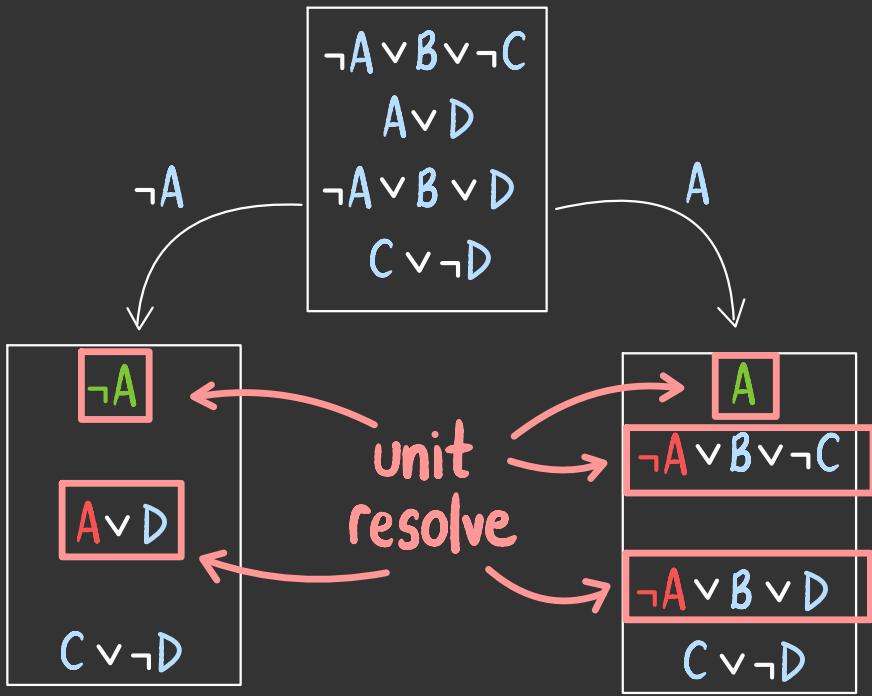
unit resolution in practice



unit resolution in practice

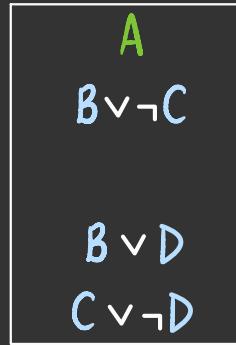
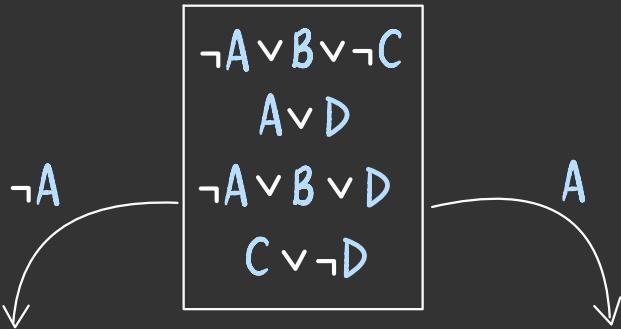
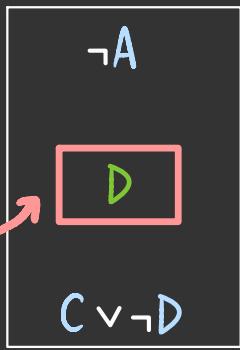


unit resolution in practice

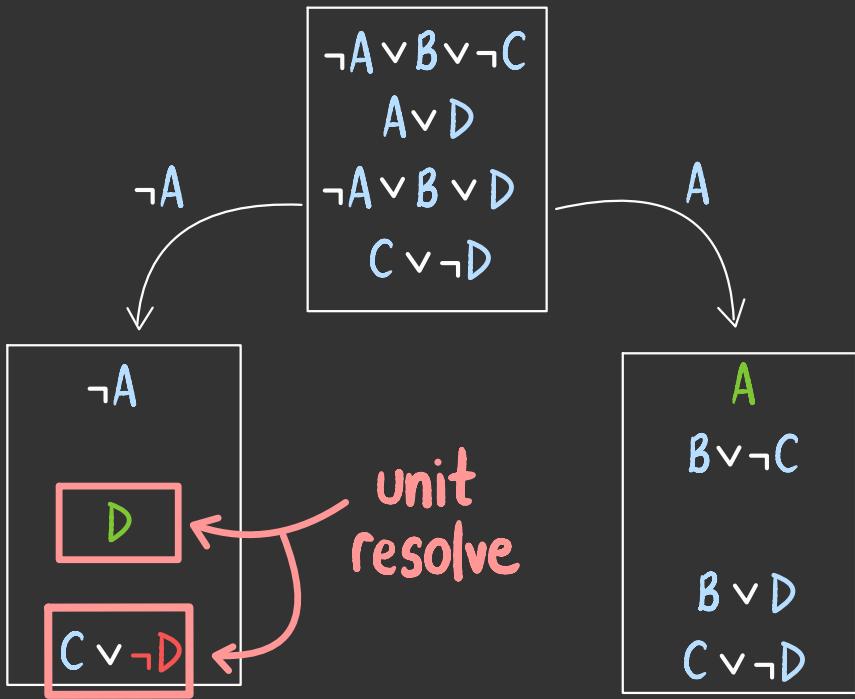


unit resolution in practice

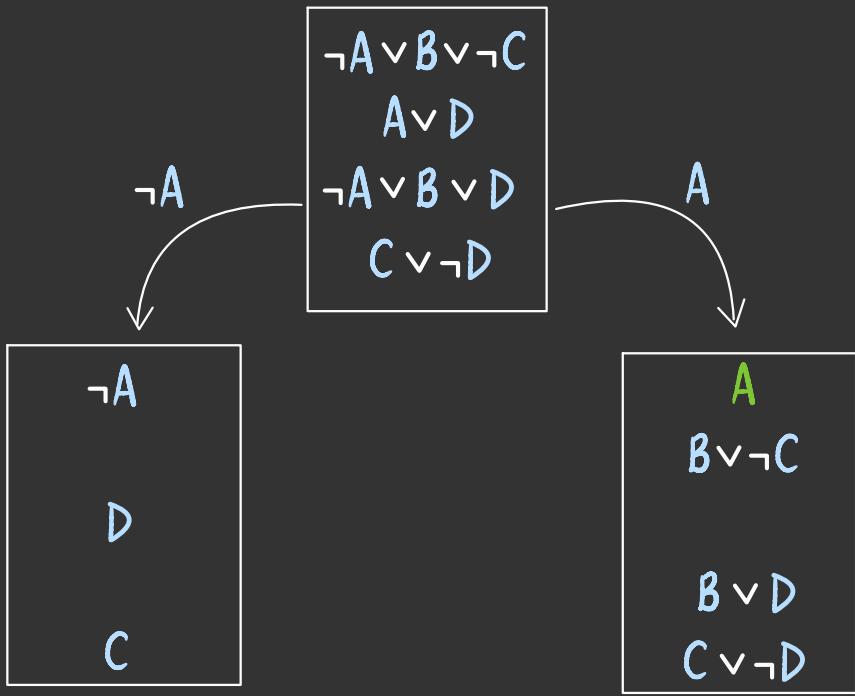
we derived
a new unit
clause



unit resolution in practice

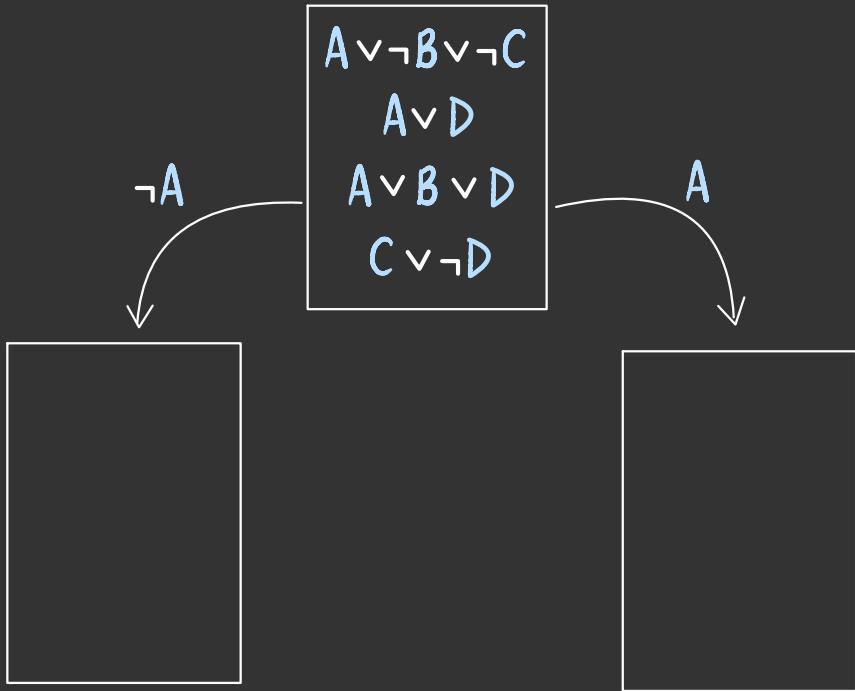


unit resolution in practice



unit resolution in practice

DPLL often incorporates
additional optimizations



↑ ↑
do we need to explore both subtrees?

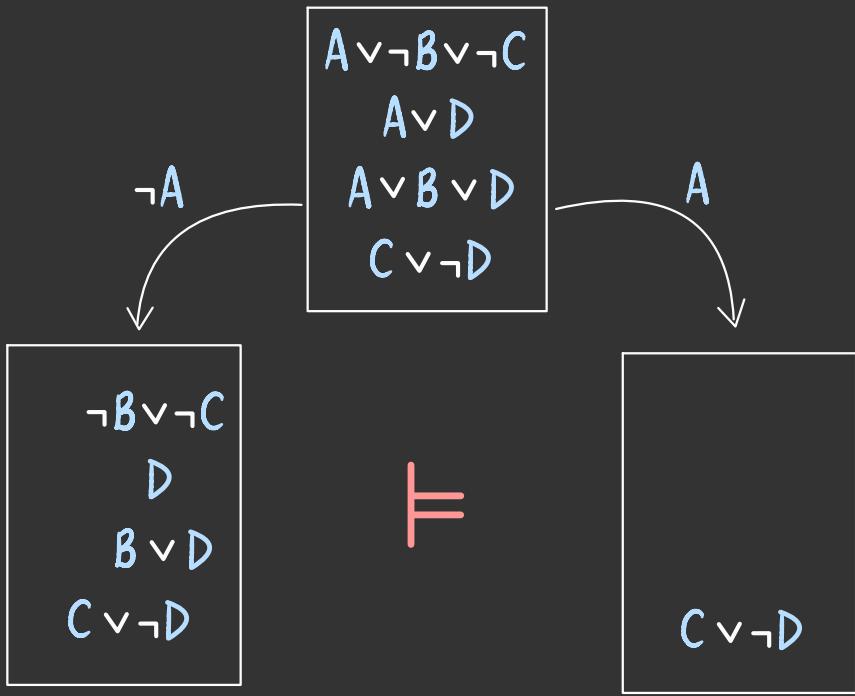
$A \vee \neg B \vee \neg C$
 $A \vee D$
 $A \vee B \vee D$
 $C \vee \neg D$

$\neg A$

A

$A \vee \neg B \vee \neg C$
 $\textcolor{red}{A} \vee D$
 $\textcolor{red}{A} \vee B \vee D$
 $C \vee \neg D$

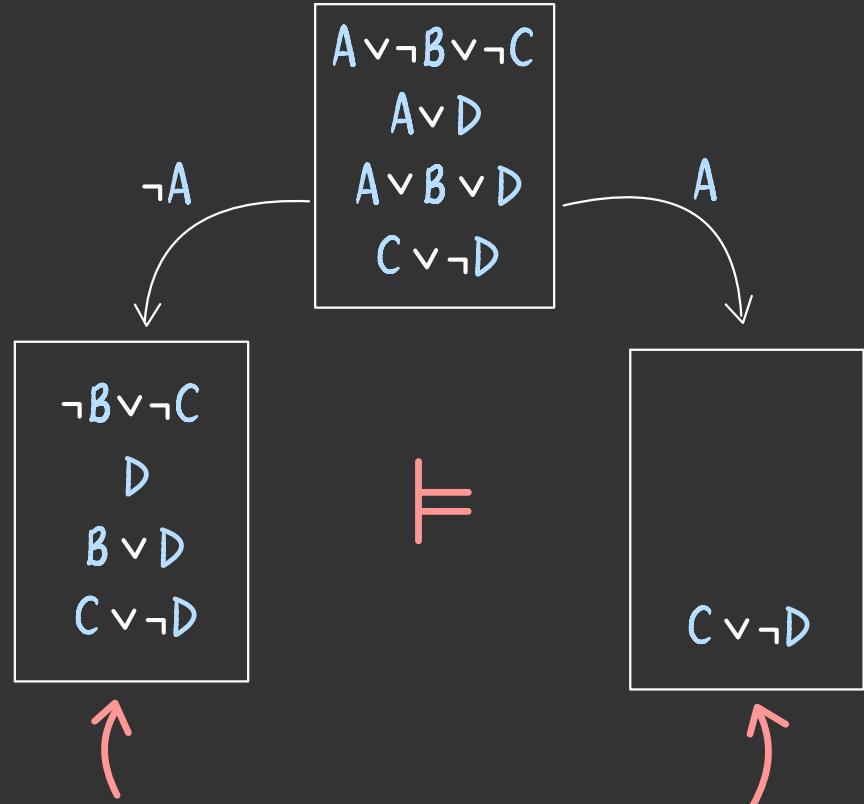
$\textcolor{green}{A} \vee \neg B \vee \neg C$
 $\textcolor{green}{A} \vee D$
 $\textcolor{green}{A} \vee B \vee D$
 $C \vee \neg D$



any model that
satisfies these clauses

also
satisfies these clauses

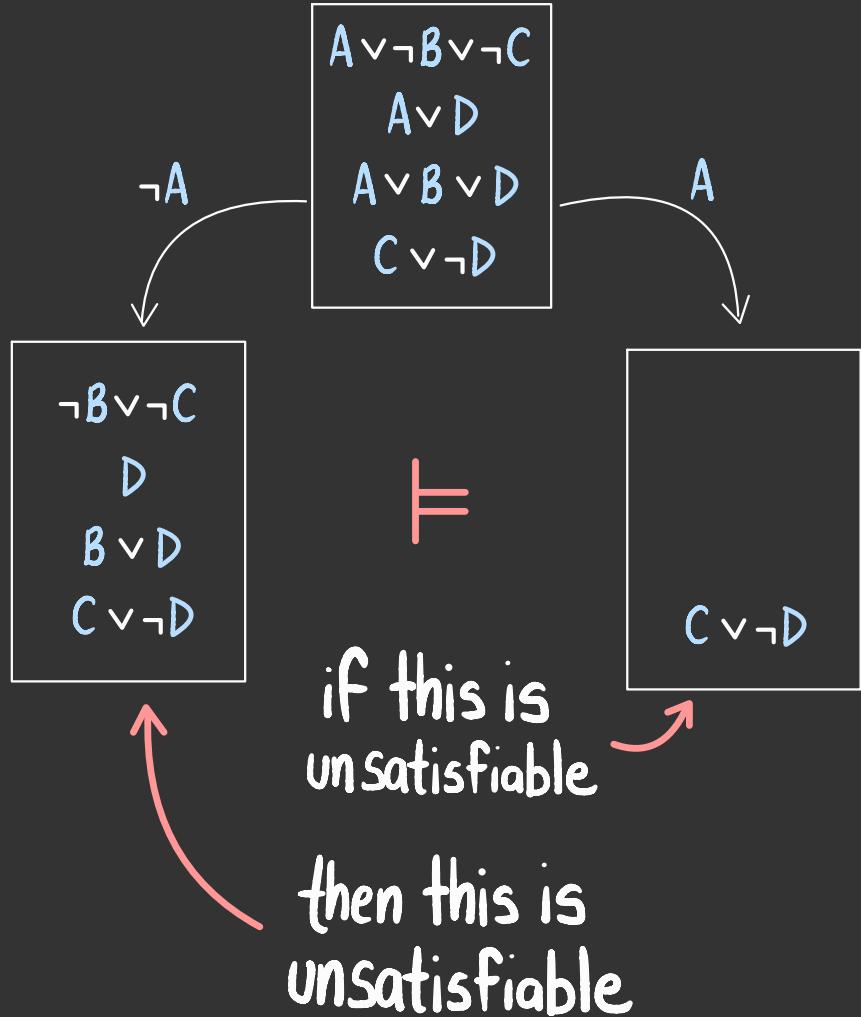
so which
subtree
do we
explore?



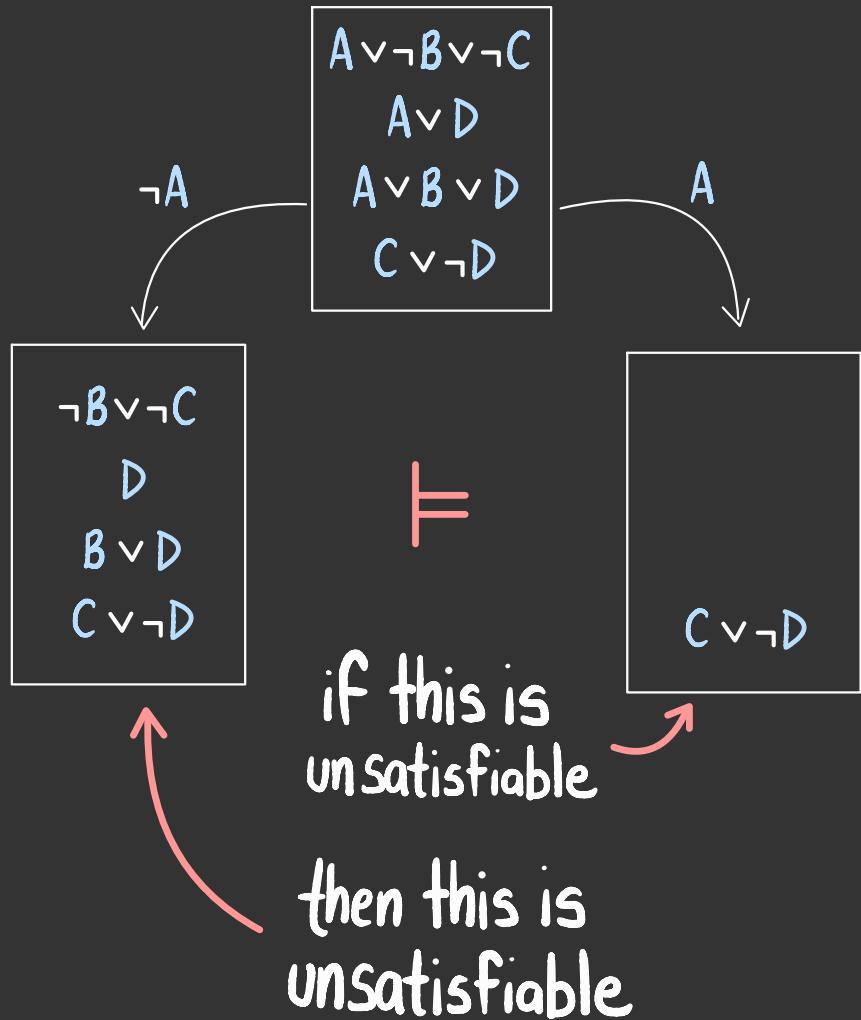
if this is
satisfiable

then this is
satisfiable

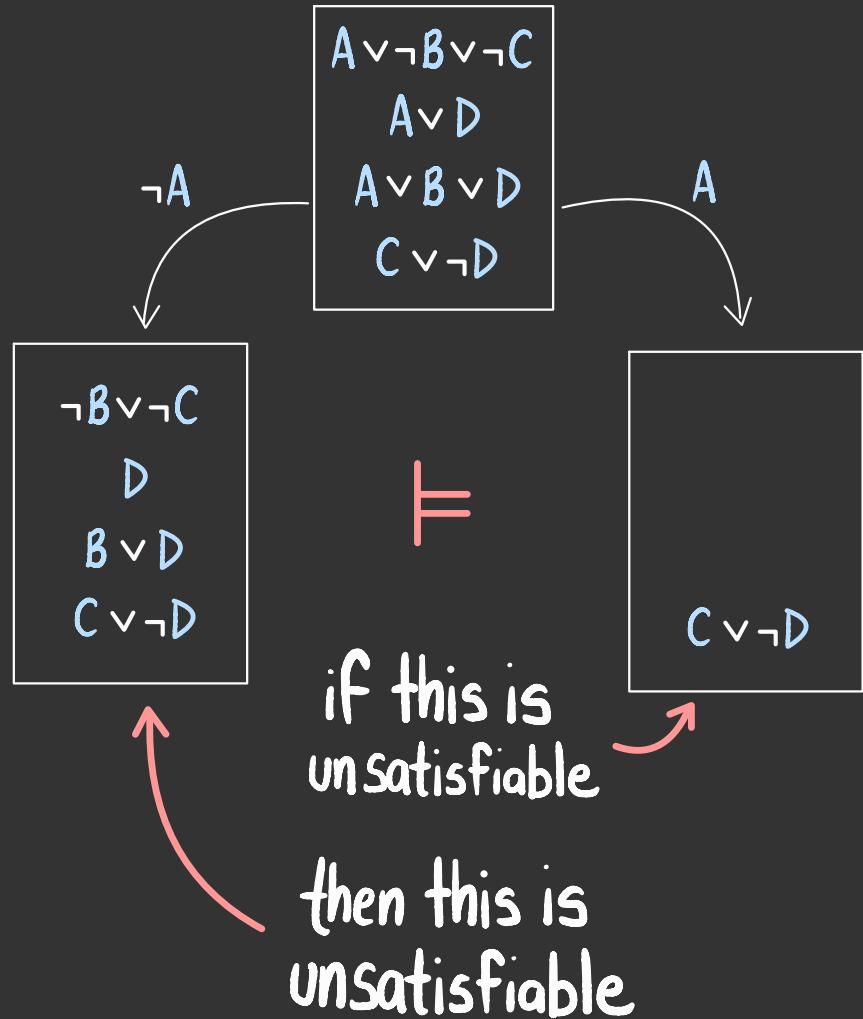
so which
subtree
do we
explore?



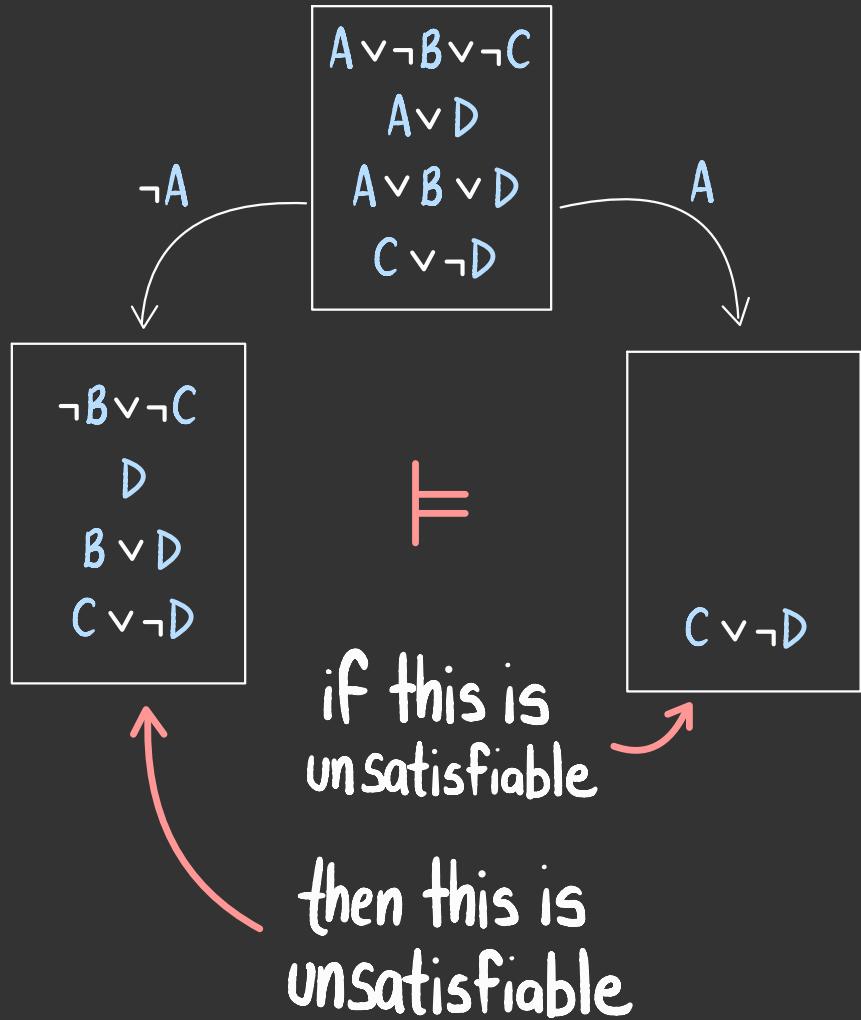
if we explore either subtree and find a satisfying model, then we can conclude the sentence is satisfiable



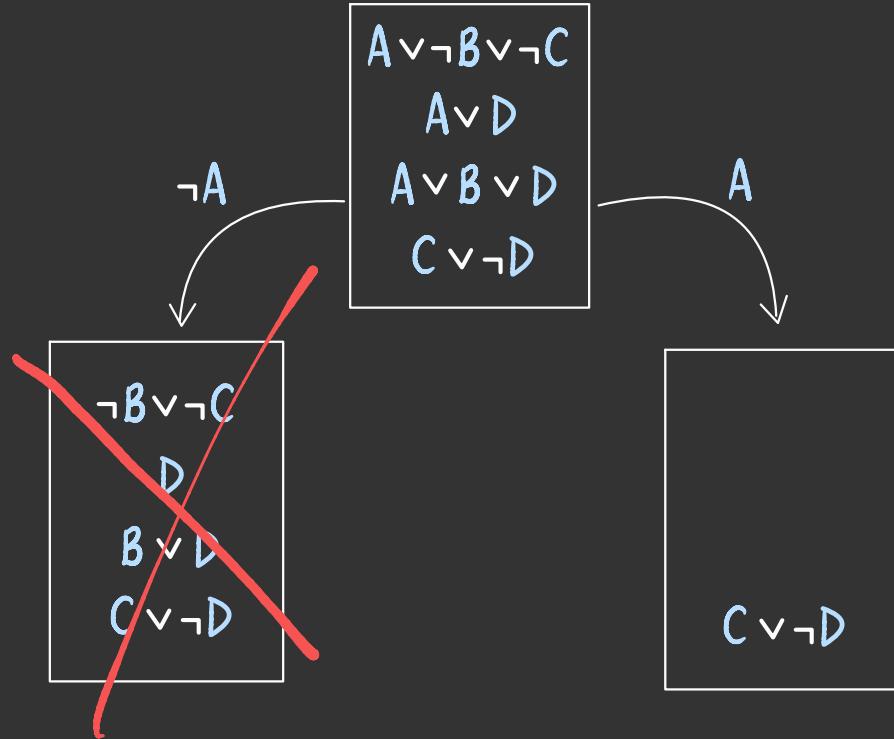
if we explore
the left subtree
and find no
satisfying models,
then the right
subtree might
still be
satisfiable



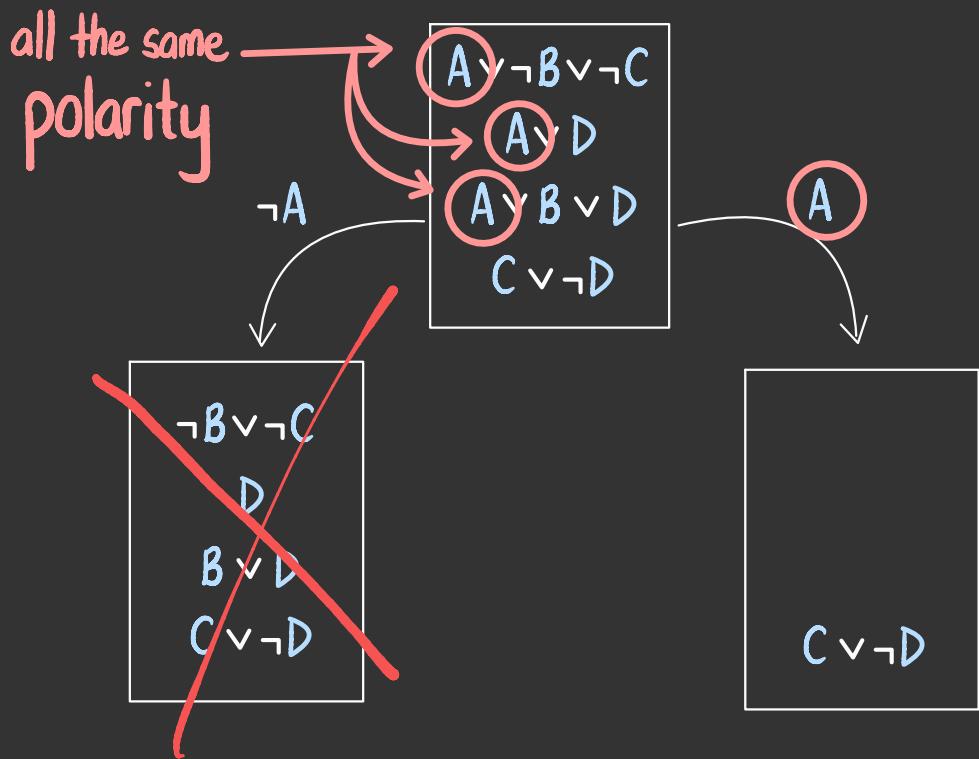
but if we explore
the right subtree
and find no
satisfying models,
then the left
subtree is also
unsatisfiable



so it is sufficient
to just explore
the right subtree



this is an example of the pure symbol heuristic



if a literal appears with only one "polarity", then we don't need to consider the opposite polarity

the pure symbol heuristic

basil or no cheese

$B \vee \neg C$

no anchovies

$\neg A$

cheese or no anchovies

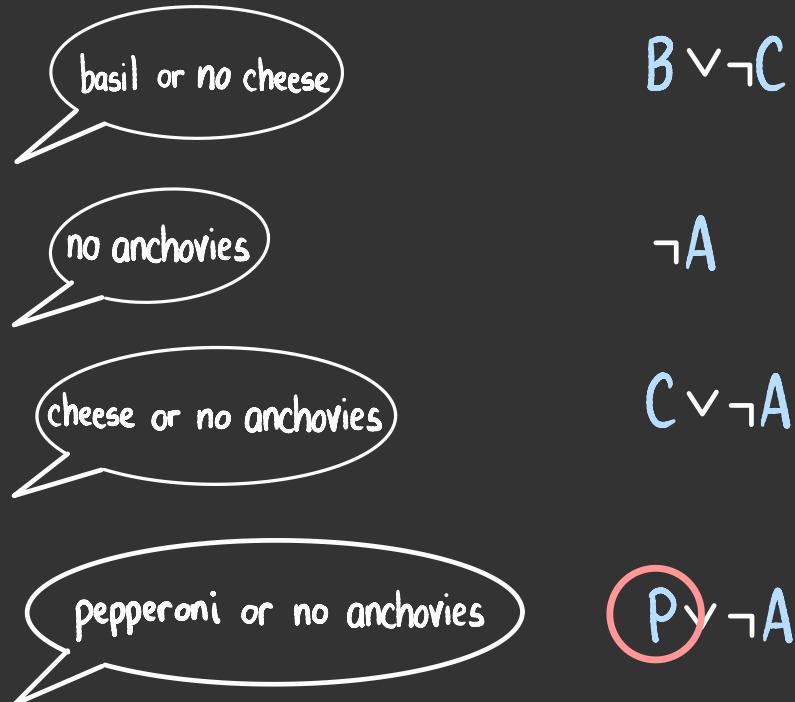
$C \vee \neg A$

pepperoni or no anchovies

$P \vee \neg A$

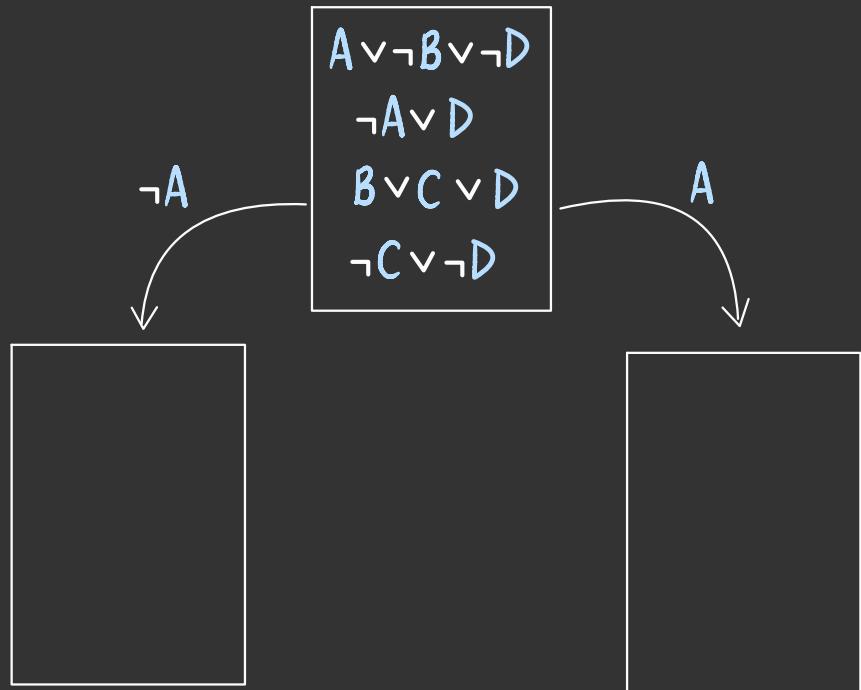
if no one wants anchovies, then
don't put anchovies on the pizza

the pure symbol heuristic

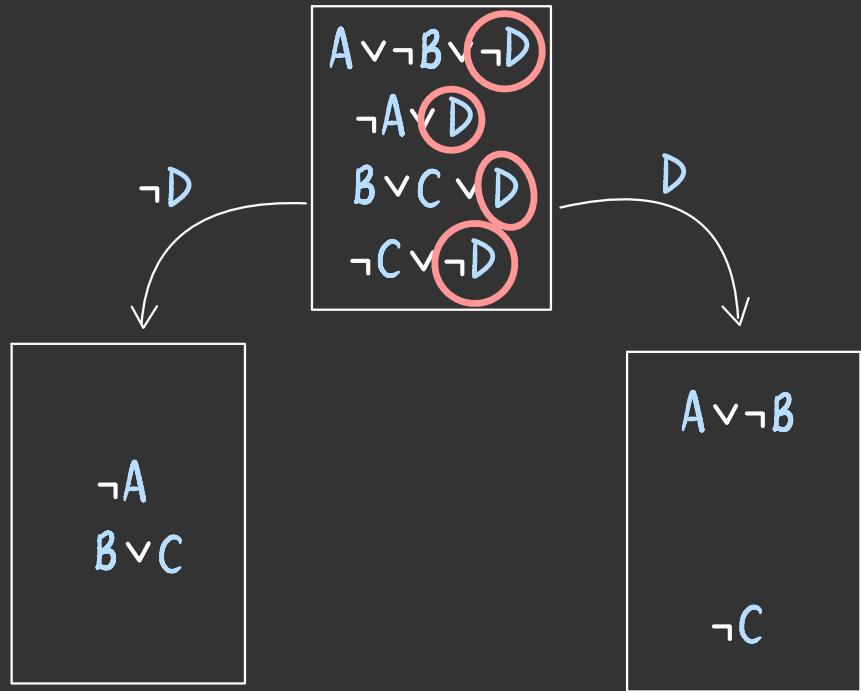


if no one objects to pepperoni, then
just put pepperoni on the pizza

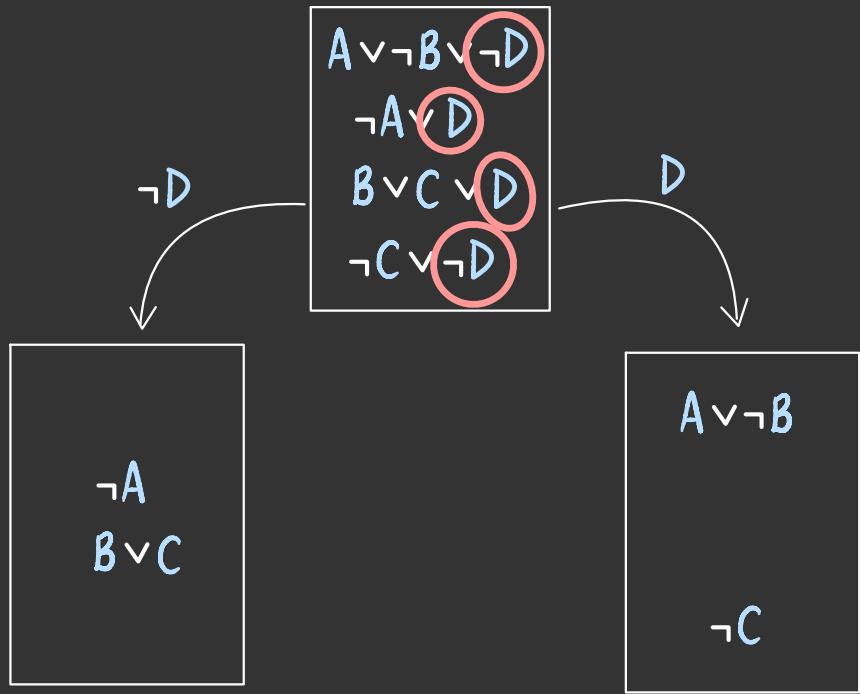
is A the best
first variable
to assign?



D is involved in
more clauses,
and so will
more likely
simplify our
clauses



this is an
example of the
degree
heuristic



assign the symbol that appears in the most clauses

but!

no matter what we do,
satisfiability is NP-complete,
so dpll will always* take
(in the worst-case)
exponential time
in the number of clauses

*unless P=NP

however, can we
characterize
these worst-
case scenarios?

no matter what we do,
satisfiability is NP-complete,
so dpll will always* take
(in the **worst-case**
exponential time
in the number of clauses

*unless P=NP

suppose we create a cnf sentence by
randomly creating m three-literal clauses
from a signature with n symbols

$$\Sigma = \{ A_1, \dots, A_n \}$$

$$m = 2$$

$$A_3 \vee A_7 \vee \neg A_8$$
$$\neg A_3 \vee \neg A_{10} \vee A_{15}$$

$$m = 4$$

$$\neg A_1 \vee A_3 \vee \neg A_7$$
$$A_6 \vee \neg A_7 \vee A_{11}$$
$$A_3 \vee A_5 \vee \neg A_{15}$$
$$\neg A_7 \vee \neg A_{11} \vee A_{14}$$

suppose we create a cnf sentence by
randomly creating m three-literal clauses
from a signature with n symbols

$$\Sigma = \{ A_1, \dots, A_n \}$$

$m = 2$ \leftarrow which is more \rightarrow $m = 4$

$$A_3 \vee A_7 \vee \neg A_8$$
$$\neg A_3 \vee \neg A_{10} \vee A_{15}$$

likely to be
unsatisfiable?

$$\neg A_1 \vee A_3 \vee \neg A_2$$
$$A_6 \vee \neg A_7 \vee A_{11}$$
$$A_3 \vee A_5 \vee \neg A_{15}$$
$$\neg A_7 \vee \neg A_{11} \vee A_{14}$$

suppose we create a cnf sentence by
randomly creating m three-literal clauses
from a signature with n symbols

$$\Sigma = \{ A_1, \dots, A_n \}$$

as m grows, the
sentence is more
likely to be
unsatisfiable

$$m = 4$$

$$\begin{aligned} & \neg A_1 \vee A_3 \vee \neg A_2 \\ & A_6 \vee \neg A_7 \vee A_{11} \\ & A_3 \vee A_5 \vee \neg A_{15} \\ & \neg A_7 \vee \neg A_{11} \vee A_{14} \end{aligned}$$

suppose we create a cnf sentence by
randomly creating m three-literal clauses
from a signature with n symbols

$$\Sigma = \{ A_1, \dots, A_n \}$$

$m=4, n=5 \leftarrow$ which is more $\rightarrow m=4, n=15$

$$\neg A_1 \vee A_3 \vee \neg A_4$$

$$A_1 \vee \neg A_2 \vee A_3$$

$$A_2 \vee A_4 \vee \neg A_5$$

$$\neg A_1 \vee \neg A_2 \vee A_5$$

likely to be

unsatisfiable?

$$\neg A_1 \vee A_3 \vee \neg A_7$$

$$A_6 \vee \neg A_7 \vee A_{11}$$

$$A_3 \vee A_5 \vee \neg A_{15}$$

$$\neg A_7 \vee \neg A_{11} \vee A_{14}$$

suppose we create a cnf sentence by
randomly creating m three-literal clauses
from a signature with n symbols

$$\Sigma = \{ A_1, \dots, A_n \}$$

$$m=4, n=5$$

$$\neg A_1 \vee A_3 \vee \neg A_4$$

$$A_1 \vee \neg A_2 \vee A_3$$

$$A_2 \vee A_4 \vee \neg A_5$$

$$\neg A_1 \vee \neg A_2 \vee A_5$$

as n shrinks, the
sentence is more
likely to be
unsatisfiable

to the
laptop!

