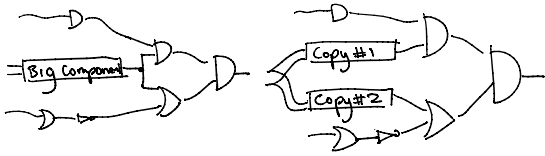


Announcements:

- ① No class on Monday.
- ② Project proposals due on Feb 19
- ③ Typo in hw has been fixed.

	Circuits	Formulas	CNF	DNF	ROBDD
sat	NPC	NPC	NPC	trivial	trivial
validity	coNPC	coNPC	trivial	coNPC	trivial
model counting	#PC	#PC	#PC	#PC	trivial

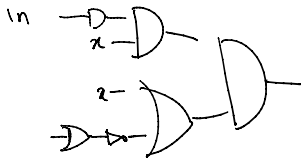
Circuits \implies Formulas



Possibly exponential blowup.

Challenge: getting rid of fanout
 aka. sharing
 aka. let bindings

let $x = \text{Big Component}$



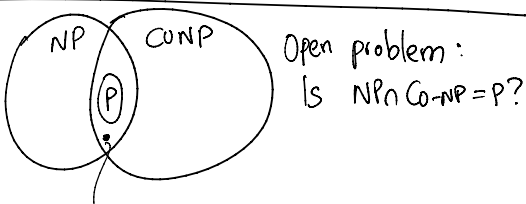
Formulas \implies CNF, DNF

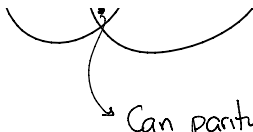
Distributivity: $A \cdot B + C = (A + C) \cdot (B + C)$
 $(A + B) \cdot C = A \cdot C + B \cdot C$

Double negations: $\overline{\overline{A}} = A$

De Morgan: $\overline{A \cdot B} = \overline{A} + \overline{B}$
 $\overline{A + B} = \overline{A} \cdot \overline{B}$

Possibly exponential blowup.





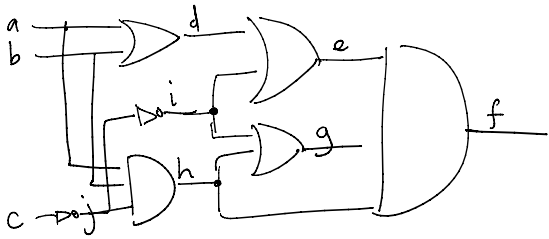
Can parity games be solved in poly time?

Circuit \implies Equivalent formula

Formula \implies Equivalent CNF

Circuit \implies Equisatisfiable CNF

Tseitin's transform



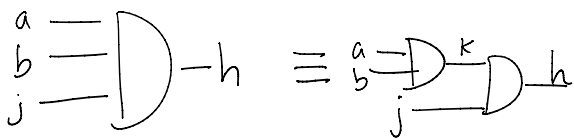
$\varphi(a, b, c) \iff \Psi(a, b, c, d, e, f, g, h, i, j)$
 equisatisfiable

$$\boxed{d = a + b} \equiv d \implies a + b \text{ and } a + b \implies d$$

$$\underbrace{(\bar{d} + a + b)} \text{ and } \underbrace{(\bar{a} + \bar{b} + d)}$$

$$\underbrace{\bar{a} \cdot \bar{b} + d}$$

$$\boxed{(\bar{d} + a + b) \cdot (\bar{a} + d) (\bar{b} + d)}$$



$$k = a \cdot b \equiv k \implies a \cdot b \text{ and } a \cdot b \implies k$$

$$\bar{k} + a \cdot b \text{ and } \bar{a} \cdot \bar{b} + k$$

$$(\bar{k} + a) \cdot (\bar{k} + b) \text{ and } (\bar{a} + \bar{b} + k)$$

$c \rightarrow \bar{c} \rightarrow j$

$$j = \bar{c} \equiv j \implies \bar{c} \text{ and } \bar{c} \implies j$$

$$(\bar{j} + \bar{c}) \text{ and } (\bar{\bar{c}} + j)$$

$(\bar{j} + \bar{c})$ and $(\bar{c} + j)$

$(\bar{j} + \bar{c})$ and $(c + j)$

Theorem: $\varphi(a, b, c)$ is satisfiable

iff $\Psi(a, b, c, \dots)$ is satisfiable.

Proof

Case 1: If φ is satisfiable
then Ψ is satisfiable.

Just use same a, b, c .

Use values computed by the
circuit for everything else.

Case 2: If Ψ is satisfiable,
then φ is satisfiable.

Just project out the values of a, b, c .

MiniSAT + satelite + Glucose...

Tools to convert formulas
into CNF.

How to determine satisfiability
of CNF formulas?

Alg 1 (φ)

① For each assignment $s: V \rightarrow \{\text{true}, \text{false}\}$
check if s satisfies φ .

If so return sat

② Return unsat

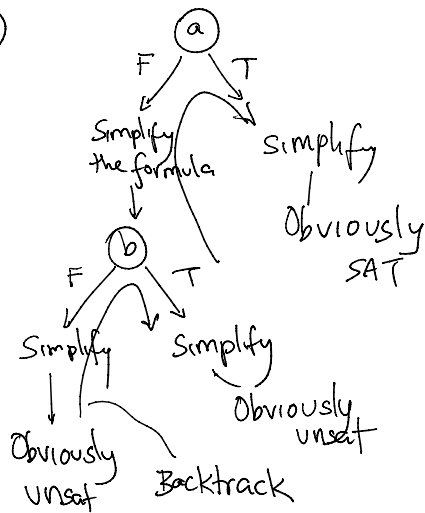
Theorem: Alg 1 returns sat iff φ
is satisfiable.

is satisfiable.

But! Might require $2^{|V|}$ time!

Incrementally coming up with satisfying assignments

$\varphi(a, b, c, d)$



$(\bar{a} + b + c) \checkmark$

and $(a + c + d) \checkmark$

and $(a + c + \bar{d}) \checkmark$

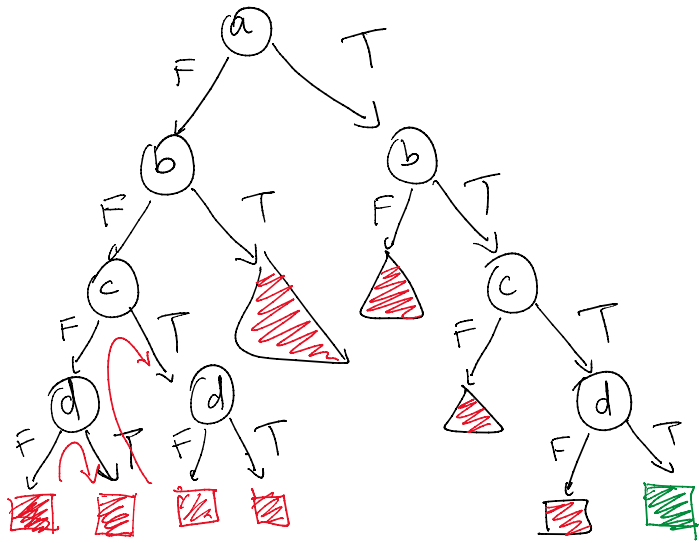
and $(a + \bar{c} + d) \checkmark$

and $(a + \bar{c} + \bar{d}) \checkmark$

and $(\bar{b} + \bar{c} + d)$

and $(\bar{a} + b + \bar{c}) \checkmark$

and $(\bar{a} + b + c) \checkmark$



Alg₂ (φ , partial assignment S)

If \exists clause $c \in \varphi$ already unsat,
return unsat

If \forall clauses C , c already sat,
then return sat.

Pick a variable $v \notin S$

If $\text{Alg}_2(\varphi, S \cup \{v\})$ return sat

If $\text{Alg}_2(\varphi, S \cup \{\bar{v}\})$ return sat

Return unsat.

Theorem: $\text{Alg}_2(\varphi, \{\})$ returns sat

Initial partial
assignment

iff φ is satisfiable.

Unit propagation

$(a + b + \bar{c})$

Partial assignment: $\{\bar{a}, b\}$.

Then c should be false in any
satisfying completion

- ① Formalize unit propagation
- ② DPLL (for free)
- ③ Polytime algorithms for
Horn-SAT
2-SAT.

Unit-Propagate (φ S partial assignment):

$S' := S$.

For each clause $c = (l_1 \text{ or } l_2 \text{ or } \dots \text{ or } l_k)$

in φ :

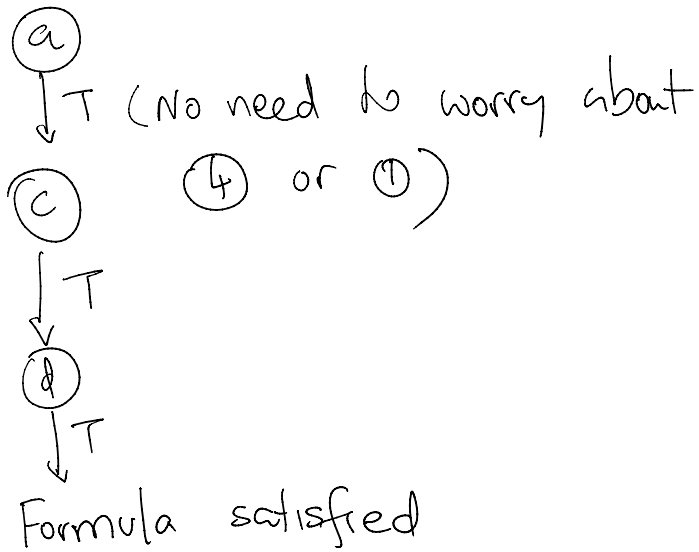
If $\exists l_i$ which is unassigned
and $\forall l_j \neq l_i, l_j$ is false
then $S' := S \cup \{l_i\}$.

If for some v , both v & $\neg v \in S'$
then report unsat

If $S' \neq S$: return
 $\text{UP}(\varphi, S')$ else
return S .

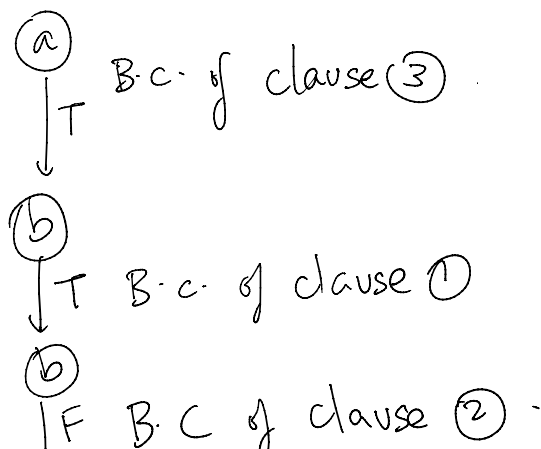
Example ① : $S = \{\}$

$(a \text{ or } b)$ and $(\bar{a} \text{ or } c)$ and $(\bar{c} \text{ or } d)$ and a .
 \equiv $\underbrace{(a \text{ or } b)}_{\textcircled{1}}$ and $\underbrace{(a \Rightarrow c)}_{\textcircled{2}}$ and $\underbrace{(c \Rightarrow d)}_{\textcircled{3}}$ and $\underbrace{a}_{\textcircled{4}}$.



Example 2 : $(\bar{a} \text{ or } b)$ and $(\bar{a} \text{ or } b)$ and a

\equiv $\underbrace{(a \Rightarrow b)}_{\textcircled{1}}$ and $\underbrace{(a \Rightarrow b)}_{\textcircled{2}}$ and $\underbrace{a}_{\textcircled{3}}$



Ⓟ
↓ F B.C of clause ②.

∴ Unsat

DPLL (φ partial assignment S)

$S' := \text{unit-propagate}(\varphi, S)$

If S' is unsat, then return unsat.

Pick a variable v not assigned in S' .

Check $r_1 = \text{DPLL}(\varphi, S' \cup \{v\})$

If r_1 is sat, return sat

Check $r_2 = \text{DPLL}(\varphi, S' \cup \{\bar{v}\})$

If r_2 is sat, return sat.

Return unsat.

Theorem: $\text{DPLL}(\varphi, \{\})$ returns sat

iff φ is satisfiable.

Vijay Ganesha / Waterloo

Maple SAT.

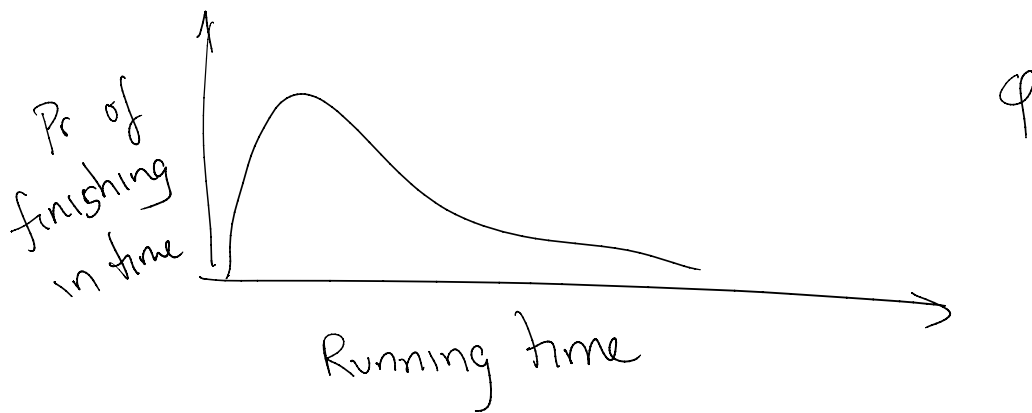
... in decide branching

Maple SAT 1.
Machine learning to decide branching
variables.

DPLL \implies Conflict Driven
Clause Learning (CDCL)

Clause learning \leftarrow

- ① Why did a partial assignment fail?
- ② Non-chronological backtracking
- ③ Restarts



-
- ① Tseitin's transform
 - ② Simple algorithms for SAT : Alg₁ & Alg₂
 - ③ Unit propagation.
 - ④ DPLL

⑤ Horn-SAT

2-SAT

⑥ CDCL (next class)

Horn-SAT: If ϕ is a formula made of
only Horn clauses then
is ϕ satisfiable?

Horn-clause: Clause $c = l_1 \vee l_2 \vee \dots \vee l_k$

c is a Horn clause if
it has at most one positive literal.

$$\bar{a} \vee \bar{b} \vee \bar{c} \equiv \overline{a \wedge b \wedge c}$$

$$\bar{a} \vee \bar{b} \vee c \equiv \overline{a \cdot b} \vee c \equiv \underbrace{a \cdot b}_{\text{}} \Rightarrow c$$

$c \leftarrow$
① Unit propagation
will start by setting
this to true

② Force you to
set other
things to
true.

③ Say we end up with a partial assignment S .

Claim: S is a part of every satisfying assignment of φ .

④ If we have discovered that the formula is unsat, we are done.

⑤ Otherwise: set all unassigned vars to false. Formula is SAT.

Example: $\underbrace{c}_{①}$ and $\underbrace{c \Rightarrow a}_{②}$ and $\underbrace{a \cdot c \Rightarrow d}_{③}$
and $\underbrace{a \cdot b \Rightarrow f}_{④}$ and $\underbrace{\bar{f} + b}_{⑤}$

Step 1: c must be true.

Step 2: a must be true

Step 3: d must be true

Unit prop is done.

Clauses ① ② ③ are satisfied

Variables b, f are unassigned.

Set them to false.

I claim ④ & ⑤ are also satisfied.

Example : $\underbrace{c \Rightarrow a}_{\textcircled{1}}$ and $\underbrace{a \cdot c \Rightarrow d}_{\textcircled{2}}$ and $\underbrace{a \cdot b \Rightarrow f}_{\textcircled{3}}$ and $\underbrace{\bar{f} + b}_{\textcircled{4}}$.

Unit propagation is a no-op.

Set every variable to false.

In every $b \Rightarrow h$, b is false. So $b \Rightarrow h$ is true.

In every $\bar{x} + \bar{y} + \dots + \bar{z}$, every var is false.

So each literal is true.

So the clause is also true.

Every clause has been satisfied.