

Normal Forms

+

DPLL

CSE 507
September 30, 2014

ZACH

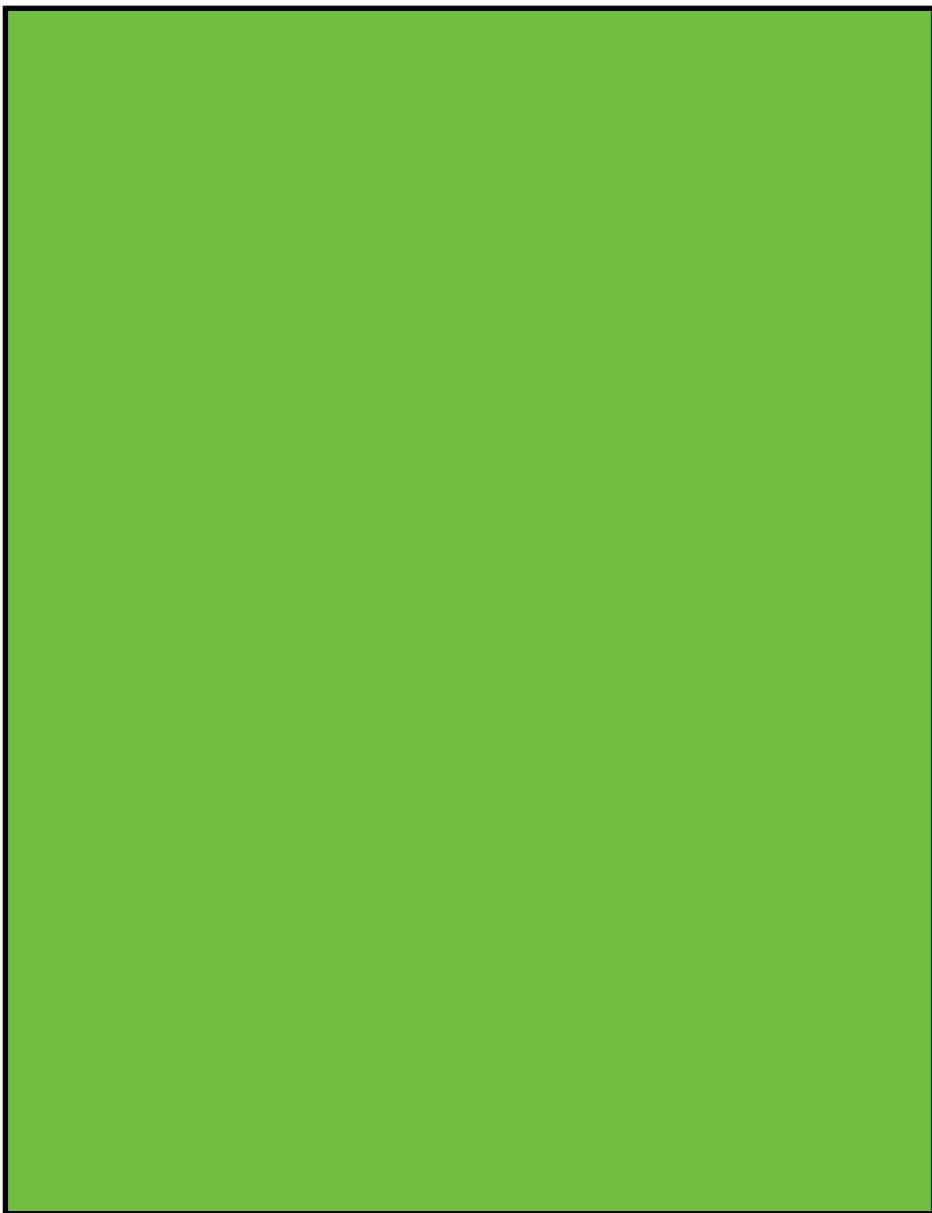


DANGER

**UNEXPLAINED
NOTATION!
ASK QUESTIONS!**

**notación inexplicable
hacer preguntas**

LOS VIOLADORES SERAN PROCESADOS



$A ::= \top \mid \perp \mid x$

Atoms

A ::= T | ⊥ | x

$A ::= \top \mid \perp \mid x$

$L ::= A \mid \sim A$

$$A ::= \top \mid \perp \mid x$$
$$L ::= A \mid \neg A$$

Literals

$A ::= \top \mid \perp \mid x$

$L ::= A \mid \sim A$

$F ::= L$
|
 $\neg F$
|
 $F \wedge F$
|
 $F \vee F$
|
 $F \rightarrow F$
|
 $F \leftrightarrow F$

$A ::= \top \mid \perp \mid x$

$L ::= A \mid \neg A$

$F ::= L$

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$F \wedge F$

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Formulas

$A ::= \top \mid \perp \mid x$

$L ::= A \mid \sim A$

$F ::= L$
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$A ::= T \mid \perp \mid x$

$L ::= A \mid \sim A$

$F ::= L$

|

$\neg F$

|

$F \wedge F$

|

$F \vee F$

|

$F \rightarrow F$

|

$F \leftrightarrow F$

A formula is satisfiable if there exists a function I from its variables to truth values such that, when we replace each variable x with $I(x)$, the formula evaluates to true.

$A ::= T \mid \perp \mid x$

$L ::= A \mid \sim A$

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 $\neg F$
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A formula is satisfiable if there exists a function I from its variables to truth values such that, when we replace each variable x with $I(x)$, the formula evaluates to true.

A formula is valid if for every function I from its variables to truth values, when we replace each variable x with $I(x)$, the formula evaluates to true.

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Formula f is valid iff $\neg f$ is

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A formula is satisfiable if there exists a function I from its variables to truth values such that, when we replace each variable x with $I(x)$, the formula evaluates to true.

A formula is valid if for every function I from its variables to truth values, when we replace each variable x with $I(x)$, the formula evaluates to true.

Formula f is valid iff $\neg f$ is

We can try to determine validity by search (enumerating assignments I) or by

Sat Solver

Sat Solver

sat f =

...

Sat Solver

define function sat that takes formula f as an

```
sat f =
```

```
...
```

Sat Solver

```
sat f =  
  case f of  
  | ...
```

Sat Solver

```
sat f =  
  case f of  
  | ...
```

analyze structure of f

Sat Solver

```
sat f =  
  case f of  
  | T => SAT  
  | ...
```

Sat Solver

```
sat f =  
  case f of  
  | T => SAT  
  | ...
```

if f is just
true,

Sat Solver

```
sat f =  
  case f of  
  | T => SAT  
  | ⊥ => UNSAT  
  | ...
```

Sat Solver

```
sat f =  
  case f of  
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  | ⊥ => UNSAT  
  | ...
```

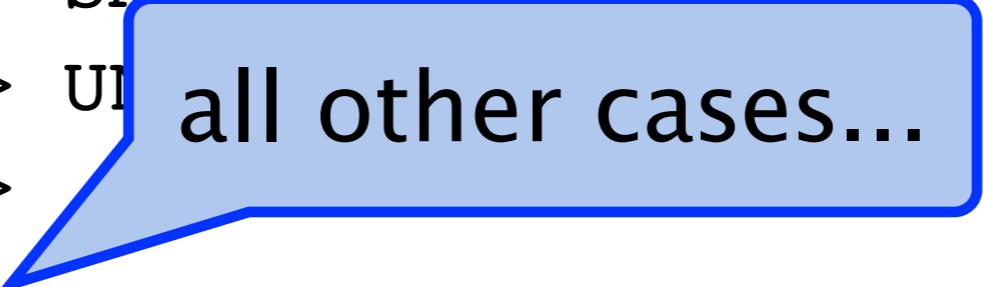
if f is just
false,

Sat Solver

```
sat f =  
  case f of  
  | T => SAT  
  | ⊥ => UNSAT  
  | _ =>  
    ...
```

Sat Solver

```
sat f =  
  case f of  
  | T => SAT  
  | ⊥ => UNSAT  
  | _ =>  
  ...
```



all other cases...

Sat Solver

```
sat f =
  case f of
    | T => SAT
    | ⊥ => UNSAT
    | _ =>
      x = pick_var f
      ...
```

Sat Solver

```
sat f =  
  case f of  
  | T => SAT  
  | ⊥ => UNSAT  
  | _ =>  
    x = pick_var f  
  ...
```

choose some
variable from f

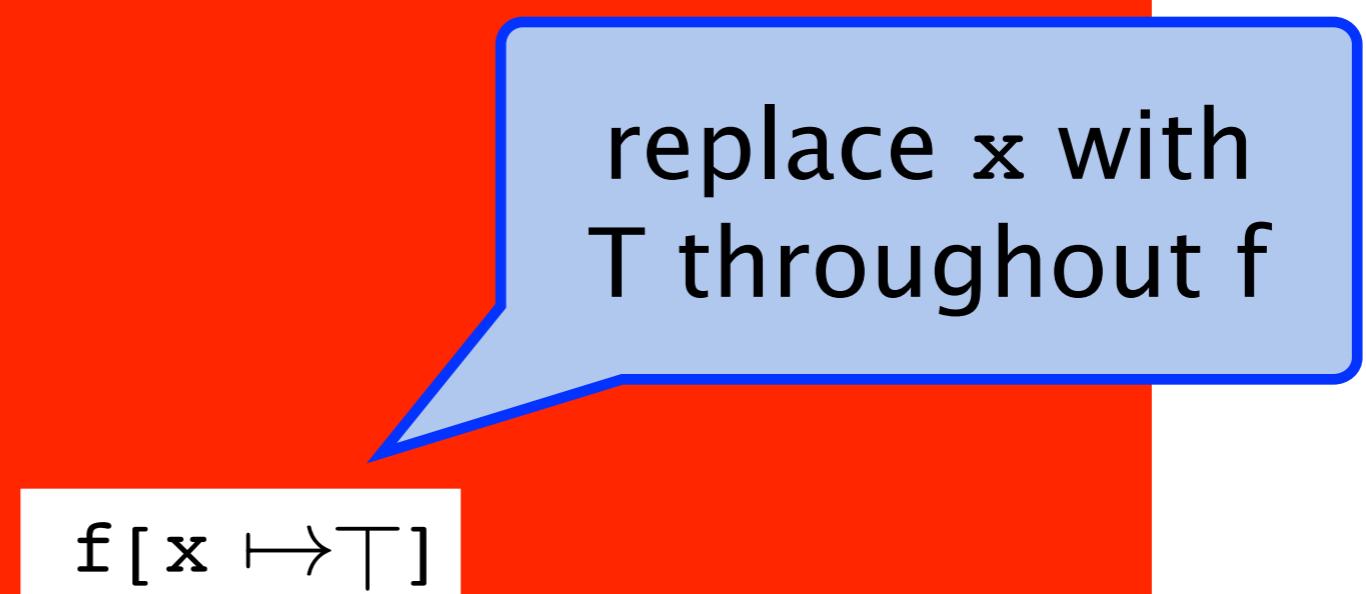
Sat Solver

```
sat f =
  case f of
    | T => SAT
    | ⊥ => UNSAT
    | _ =>
      x = pick_var f
      if sat f[x ↦ T] = SAT then
        ...
      else
```

Sat Solver

$f[x \mapsto \top]$

Sat Solver



replace x with
 \top throughout f

$f[x \mapsto \top]$

Sat Solver

replace x with
 T throughout f

$f[x \mapsto T]$

$$(x \wedge y \wedge z \rightarrow y \vee x)[x \mapsto T] = (T \wedge y \wedge z \rightarrow y \vee T)$$

Sat Solver

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sat f =
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    | ⊥ => UNSAT
    | _ =>
      x = pick_var f
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Sat Solver

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sat f =  
  case f of  
  | T => SAT  
  | ⊥ => UNSAT  
  | _ =>  
    x = pick_var f  
    if sat f[x ↦ T] = SAT then  
      ...
```

if we find a satisfying
assignment with x set to T

Sat Solver

```
sat f =
  case f of
    | T => SAT
    | ⊥ => UNSAT
    | _ =>
      x = pick_var f
      if sat f[x ↦ T] = SAT then
        SAT
      else
        ...
```

Sat Solver

```
sat f =  
  case f of  
  | T => SAT  
  | ⊥ => UNSAT  
  | _ =>  
    x = pick_var f  
    if sat f[x ↦ T] = SAT then  
      SAT  
    else  
      ...
```

then formula f is

Sat Solver

```
sat f =
  case f of
    | T => SAT
    | ⊥ => UNSAT
    | _ =>
      x = pick_var f
      if sat f[x ↦ T] = SAT then
        SAT
      else
        sat (f[x ↦ ⊥])
```

Sat Solver

```
sat f =  
  case f of  
  | T => SAT  
  | ⊥ => UNSAT  
  | _ =>  
    x = pick_var f  
    if sat (f[x ↦ ⊥]) then  
      SAT  
    else  
      sat (f[x ↦ ⊥])
```

try setting x to false ...

... and recurse

Sat Solver

```
sat f =
  case f of
    | T => SAT
    | ⊥ => UNSAT
    | _ =>
      x = pick_var f
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      else
        sat (f[x ↦ ⊥])
```

Correct?

Sat Solver

```
sat f =
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      x = pick_var f
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Sat Solver

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sat f =  
  case f of  
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    x = pick_var f  
    if sat f[x ↦ T] = SAT then  
      SAT  
    else  
      sat (f[x ↦ ⊥])
```



Today

Normal Forms

- desugaring
- negation normal form (NNF)
- disjunctive normal form (DNF)
- conjuctive normal form (CNF)

Today

Normal Forms

- desugaring
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- conjunctive normal form (CNF)

DPLL

- resolution
- binary constraint propagation
- a better sat solver

Today

clean up

Normal Forms

- desugaring
- negation normal form (NNF)
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- conjunctive normal form (CNF)

DPLL

- resolution
- binary constraint propagation
- a better sat solver

Today

clean up

Normal Forms

- desugaring
- negation normal form (NNF)
- disjunctive normal form (DNF)
- conjunctive normal form (CNF)

DPLL

combine search and

- resolution
- binary constraint propagation
- a better sat solver

$A ::= \top \mid \perp \mid x$

$L ::= A \mid \sim A$

$F ::= L$
|
 $\neg F$
|
 $F \wedge F$
|
 $F \vee F$
|
 $F \rightarrow F$
|
 $F \leftrightarrow F$

$F ::= L$
|
 $! F$
|
 $F \wedge F$
|
 $F \vee F$
|
 $F \rightarrow F$
|
 $F \leftrightarrow F$

$F ::= L$

$| ! F$

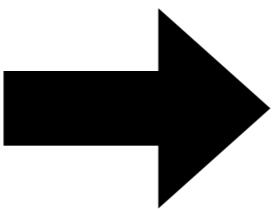
$| F \wedge F$

$| F \vee F$

$| F \rightarrow F$

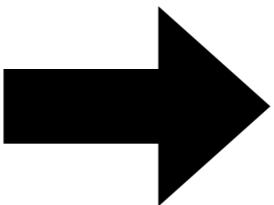
$| F \leftrightarrow F$

F :::= L
| ! F
| F \wedge F
| F \vee F
| F \rightarrow F
| F \leftrightarrow F



F :::= L
| ! F
| F \wedge F
| F \vee F

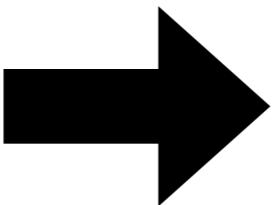
```
F ::= L  
| ! F  
| F /\ F  
| F \\/ F  
| F -> F  
| F <-> F
```



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desugar `f` =

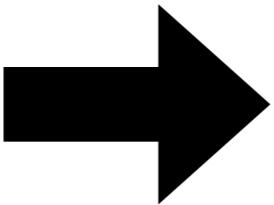
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```
F ::= L  
| ! F  
| F /\ F  
| F \\/ F
```

```
desugar f =  
case f of  
| l => l
```

```
F ::= L  
| ! F  
| F /\ F  
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| F <-> F
```



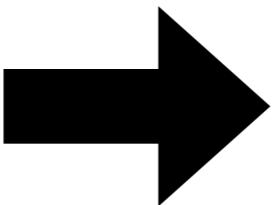
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```

```
desugar f =  
  case f of  
  | l => l  
  | f1 /\ f2 => (desugar f1) /\ (desugar f2)
```

```

F ::= L
| ! F
| F /\ F
| F \\/ F
| F -> F
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```



```

F ::= L
| ! F
| F /\ F
| F \\/ F

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```

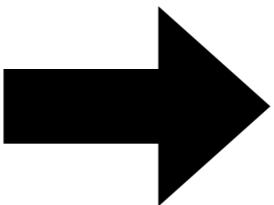
desugar f =
case f of
| l => l
| f1 /\ f2 => (desugar f1) /\ (desugar f2)
| f1 \\/ f2 => (desugar f1) \\/ (desugar f2)

```

```

F ::= L
| ! F
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```

F ::= L
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```

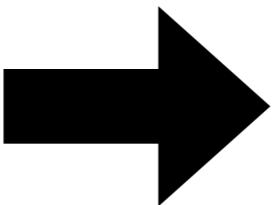
desugar f =
case f of
| l => l
| f1 /\ f2 => (desugar f1) /\ (desugar f2)
| f1 \\/ f2 => (desugar f1) \\/ (desugar f2)
| f1 -> f2 => desugar ((! f1) \\/ f2)

```

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```

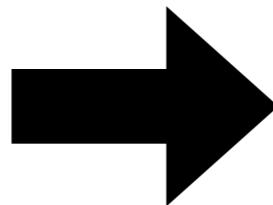
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case f of
| l => l
| f1 /\ f2 => (desugar f1) /\ (desugar f2)
| f1 \\/ f2 => (desugar f1) \\/ (desugar f2)
| f1 -> f2 => desugar ((! f1) \\/ f2)
| f1 <-> f2 => desugar ((f1 -> f2) /\ (f2 -> f1))

```

```

F ::= L
| ! F
| F /\ F
| F \\/ F
| F -> F
| F <-> F

```



```

F ::= L
| ! F
| F /\ F
| F \\/ F

```

desugar `f` =

case `f` of

- | `l` => `l`
- | `f1 /\ f2` => `(desugar f1) /\ (desugar f2)`
- | `f1 \\/ f2` => `(desugar f1) \\/ (desugar f2)`
- | `f1 -> f2` => `desugar ((! f1) \\/ f2)`
- | `f1 <-> f2` => `desugar ((f1 -> f2) /\ (f2 -> f1))`

Correct? Efficient?

$F ::= L$
| ! F
| F \wedge F
| F \vee F

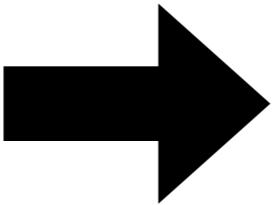
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$| F \wedge F$

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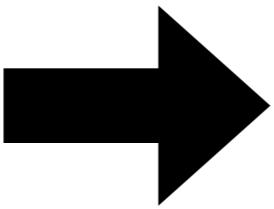
```
F ::= L  
| ! F  
| F /\ F  
| F \/\ F
```



```
F ::= L  
| F /\ F  
| F \/\ F
```

NNF

```
F ::= L  
| ! F  
| F /\ F  
| F \/\ F
```

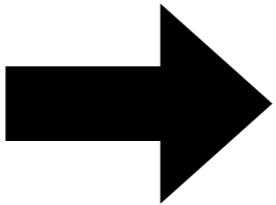


```
F ::= L  
| F /\ F  
| F \/\ F
```

NNF

pnot f =

```
F ::= L  
| ! F  
| F /\ F  
| F \/\ F
```

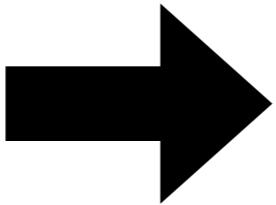


```
F ::= L  
| F /\ F  
| F \/\ F
```

NNF

```
pnot f =  
  case f of  
  | ! (~ a) => a
```

```
F ::= L  
| ! F  
| F /\ F  
| F \/\ F
```

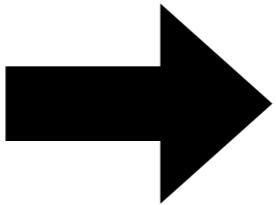


```
F ::= L  
| F /\ F  
| F \/\ F
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NNF

```
pnot f =  
  case f of  
  | ! (~ a) => a  
  | ! a         => ~ a
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```
F ::= L  
| F /\ F  
| F \/\ F
```

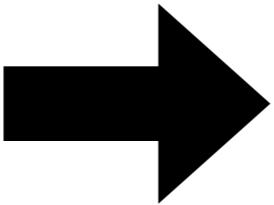
NNF

```
pnot f =  
  case f of  
  | ! (~ a) => a  
  | ! a         => ~ a  
  | ! ! f       => pnot f
```

```

F ::= L
| ! F
| F /\ F
| F \\/ F

```



```

F ::= L
| F /\ F
| F \\/ F

```

NNF

```

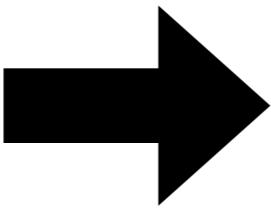
pnot f =
  case f of
  | ! (~ a) => a
  | ! a        => ~ a
  | ! ! f     => pnot f
  | ! (f1 /\ f2) => pnot (( ! f1) \\/ ( ! f2))

```

```

F ::= L
| ! F
| F /\ F
| F \\/ F

```



```

F ::= L
| F /\ F
| F \\/ F

```

NNF

```

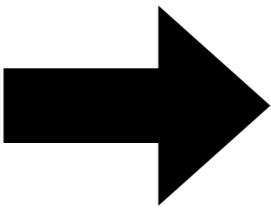
pnot f =
case f of
| ! (~ a) => a
| ! a         => ~ a
| ! ! f       => pnot f
| ! (f1 /\ f2) => pnot (( ! f1) \\/ ( ! f2))
| ! (f1 \\/ f2) => pnot (( ! f1) /\ ( ! f2))

```

```

F ::= L
| ! F
| F /\ F
| F \/\ F

```



```

F ::= L
| F /\ F
| F \/\ F

```

NNF

```

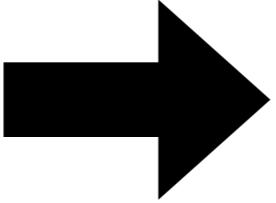
pnot f =
case f of
| ! (~ a) => a
| ! a         => ~ a
| ! ! f       => pnot f
| ! (f1 /\ f2) => pnot (( ! f1) \/\ (! f2))
| ! (f1 \/\ f2) => pnot (( ! f1) /\ (! f2))
| f1 /\ f2     => (pnot f1) /\ (pnot f2)

```

```

F ::= L
| ! F
| F /\ F
| F \\/ F

```



```

F ::= L
| F /\ F
| F \\/ F

```

NNF

```

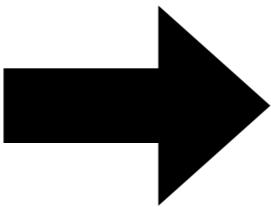
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| ! a         => ~ a
| ! ! f       => pnot f
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| ! (f1 \\/ f2) => pnot (( ! f1) /\ ( ! f2))
| f1 /\ f2    => (pnot f1) /\ (pnot f2)
| f1 \\/ f2    => (pnot f1) \\/ (pnot f2)

```

```

F ::= L
| ! F
| F /\ F
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```

F ::= L
| F /\ F
| F \\/ F

```

NNF

```

pnot f =
  case f of
    | ! (~ a) => a
    | ! a        => ~ a
    | ! ! f      => pnot f
    | ! (f1 /\ f2) => pnot (( ! f1) \\/ ( ! f2))
    | ! (f1 \\/ f2) => pnot (( ! f1) /\ ( ! f2))
    | f1 /\ f2     => (pnot f1) /\ (pnot f2)
    | f1 \\/ f2     => (pnot f1) \\/ (pnot f2)
  
```

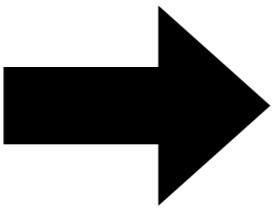
Correct? Efficient?

```
F ::= L  
    | F /\ F  
    | F \/ F
```

$F ::= L$

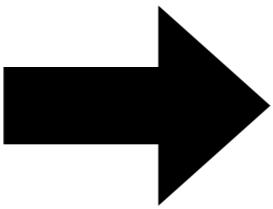
$|$
 $F \wedge F$

$|$
 $F \vee F$

$$\begin{array}{l} F ::= L \\ | \quad F \wedge F \\ | \quad F \vee F \end{array}$$

$$\begin{array}{l} F ::= C \mid C \vee F \\ C ::= L \mid L \wedge C \end{array}$$

DNF

```
F ::= L  
| F /\ F  
| F \ F
```

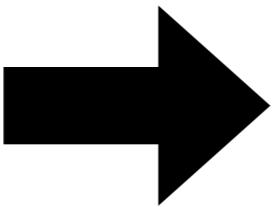


```
F ::= C | C \ F  
C ::= L | L /\ C
```

DNF

```
dnf f =
```

```
F ::= L  
| F /\ F  
| F \ F
```

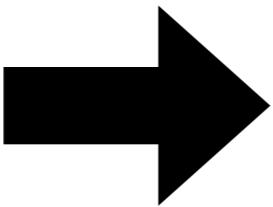


```
F ::= C | C \ F  
C ::= L | L /\ C
```

DNF

```
dnf f =  
case f of  
| 1 => 1
```

```
F ::= L  
| F /\ F  
| F \/\ F
```

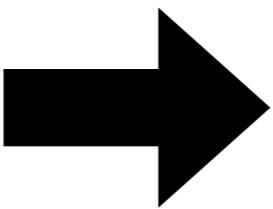


```
F ::= C | C \vee F  
C ::= L | L /\ C
```

DNF

```
dnf f =  
case f of  
| 1 => 1  
| (f1 \/\ f2) /\ f3 => dnf ((f1 /\ f3) \/\ (f2 /\ f3))
```

```
F ::= L  
| F /\ F  
| F \/\ F
```



```
F ::= C | C \vee F  
C ::= L | L /\ C
```

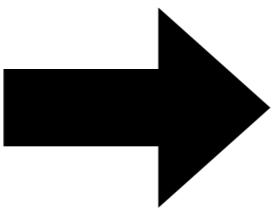
DNF

```
dnf f =  
case f of  
| 1 => 1  
| (f1 \/\ f2) /\ f3 => dnf ((f1 /\ f3) \/\ (f2 /\ f3))  
| f1 /\ (f2 \/\ f3) => dnf ((f1 /\ f2) \/\ (f1 /\ f3))
```

```

F ::= L
| F /\ F
| F \\/ F

```



```

F ::= C | C \vee F
C ::= L | L /\ C

```

DNF

```

dnf f =
case f of
| 1 => 1
| (f1 \/\ f2) /\ f3 => dnf ((f1 /\ f3) \/\ (f2 /\ f3))
| f1 /\ (f2 \/\ f3) => dnf ((f1 /\ f2) \/\ (f1 /\ f3))
| f1 /\ f2 => (dnf f1) X (dnf f2)

```

$F ::= L$ $| F \wedge F$ $F ::= C \quad | \quad C \vee F$ $C ::= L \quad | \quad L \wedge C$

$$(a_1 \vee \dots \vee a_k) \times (b_1 \vee \dots \vee b_n) =$$

$$(a_1 \wedge b_1) \vee \dots \vee$$

$$(a_i \wedge b_j) \vee \dots \vee$$

$$(a_k \wedge b_n)$$

$$(\text{f1} \vee \text{f2})$$

$$\text{f1} \wedge (\text{f2} \vee \text{f3})$$

$$\text{f1} \wedge \text{f2} \Rightarrow (\text{dnf f1}) \times (\text{dnf f2})$$

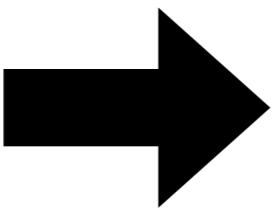
$$(\text{f2} \wedge \text{f3}) \vee (\text{f2} \wedge \text{f1})$$

$$(\text{f1} \wedge \text{f3}) \vee (\text{f1} \wedge \text{f2})$$

```

F ::= L
| F /\ F
| F \\/ F

```



```

F ::= C | C \vee F
C ::= L | L /\ C

```

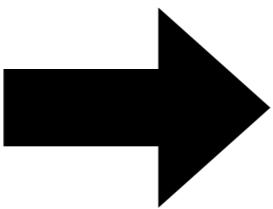
DNF

```

dnf f =
case f of
| 1 => 1
| (f1 \/\ f2) /\ f3 => dnf ((f1 /\ f3) \/\ (f2 /\ f3))
| f1 /\ (f2 \/\ f3) => dnf ((f1 /\ f2) \/\ (f1 /\ f3))
| f1 /\ f2 => (dnf f1) X (dnf f2)
| f1 \/\ f2 => (dnf f1) \/\ (dnf f2)

```

```
F ::= L  
| F /\ F  
| F \/\ F
```



```
F ::= C | C \vee F  
C ::= L | L /\ C
```

DNF

```
dnf f =  
case f of  
| 1 => 1  
| (f1 \/\ f2) /\ f3 => dnf ((f1 /\ f3) \/\ (f2 /\ f3))  
| f1 /\ (f2 \/\ f3) => dnf ((f1 /\ f2) \/\ (f1 /\ f3))  
| f1 /\ f2 => (dnf f1) X (dnf f2)  
| f1 \/\ f2 => (dnf f1) \vee (dnf f2)
```

Correct? Efficient?

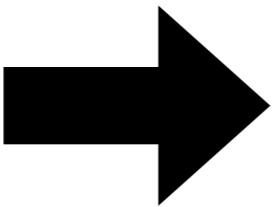
$F ::= L$

$|$
 $F \wedge F$
 $|$
 $F \vee F$

$F ::= L$

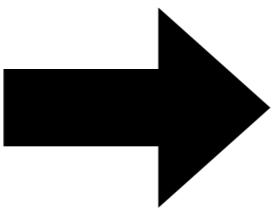
$|$
 $F \wedge F$

$|$
 $F \vee F$

$$\begin{array}{l} F ::= L \\ | \quad F \wedge F \\ | \quad F \vee F \end{array}$$

$$\begin{array}{l} F ::= D \quad | \quad D \wedge C \\ D ::= L \quad | \quad L \vee D \end{array}$$

CNF

```
F ::= L  
| F /\ F  
| F \vee F
```

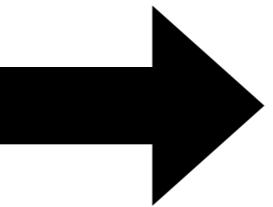


```
F ::= D | D /\ C  
D ::= L | L \vee D
```

CNF

cnf f =

```
F ::= L  
| F /\ F  
| F \vee F
```

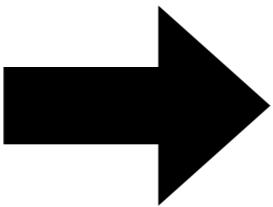


```
F ::= D | D /\ C  
D ::= L | L \vee D
```

CNF

```
cnf f =  
  case f of  
  | 1 => 1
```

```
F ::= L  
| F /\ F  
| F \vee F
```



```
F ::= D | D /\ C  
D ::= L | L \vee D
```

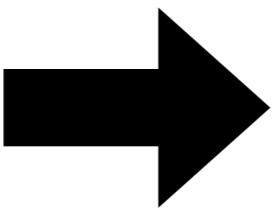
CNF

```
cnf f =  
  case f of  
  | 1 => 1  
  | (f1 /\ f2) \vee f3 => cnf ((f1 \vee f3) /\ (f2 \vee f3))
```

```

F ::= L
| F /\ F
| F \vee F

```



```

F ::= D | D /\ C
D ::= L | L \vee D

```

CNF

```

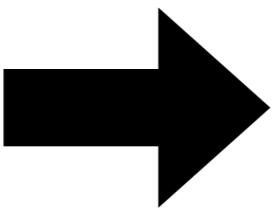
cnf f =
  case f of
  | 1 => 1
  | (f1 /\ f2) \vee f3 => cnf ((f1 \vee f3) /\ (f2 \vee f3))
  | f1 \vee (f2 /\ f3) => cnf ((f1 \vee f2) /\ (f1 \vee f3))

```

```

F ::= L
| F /\ F
| F \vee F

```



```

F ::= D | D /\ C
D ::= L | L \vee D

```

CNF

```

cnf f =
  case f of
  | 1 => 1
  | (f1 /\ f2) \vee f3 => cnf ((f1 \vee f3) /\ (f2 \vee f3))
  | f1 \vee (f2 /\ f3) => cnf ((f1 \vee f2) /\ (f1 \vee f3))
  | f1 \vee f2 => (cnf f1) X (cnf f2)

```

$F ::= L$

$| F \wedge F$

$F ::= D \quad | \quad D \wedge C$

$D ::= L \quad | \quad L \vee D$

$$(a_1 \wedge \dots \wedge a_k) \times (b_1 \wedge \dots \wedge b_n) =$$

$$\begin{aligned} & (a_1 \vee b_1) \wedge \dots \wedge \\ & (a_i \vee b_j) \wedge \dots \wedge \\ & (a_k \vee b_n) \end{aligned}$$

$$(\perp \wedge f_2)$$

$$f_1 \vee (f_2 \wedge f_3)$$

$$f_1 \vee f_2 \Rightarrow (\text{cnf } f_1) \times (\text{cnf } f_2)$$

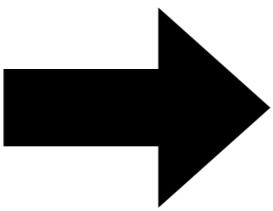
$$(\perp \wedge f_2) \wedge (f_2 \vee f_3)$$

$$(f_1 \vee f_2) \wedge (f_1 \vee f_3)$$

```

F ::= L
| F /\ F
| F \vee F

```



```

F ::= D | D /\ C
D ::= L | L \vee D

```

CNF

```

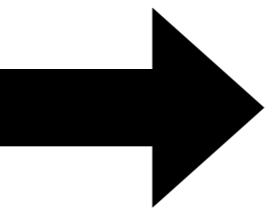
cnf f =
  case f of
  | 1 => 1
  | (f1 /\ f2) \vee f3 => cnf ((f1 \vee f3) /\ (f2 \vee f3))
  | f1 \vee (f2 /\ f3) => cnf ((f1 \vee f2) /\ (f1 \vee f3))
  | f1 \vee f2 => (cnf f1) X (cnf f2)
  | f1 /\ f2 => (cnf f1) /\ (cnf f2)

```

```

F ::= L
| F /\ F
| F \vee F

```



```

F ::= D | D /\ C
D ::= L | L \vee D

```

CNF

```

cnf f =
case f of
| 1 => 1
| (f1 /\ f2) \vee f3 => cnf ((f1 \vee f3) /\ (f2 \vee f3))
| f1 \vee (f2 /\ f3) => cnf ((f1 \vee f2) /\ (f1 \vee f3))
| f1 \vee f2 => (cnf f1) X (cnf f2)
| f1 /\ f2 => (cnf f1) /\ (cnf f2)

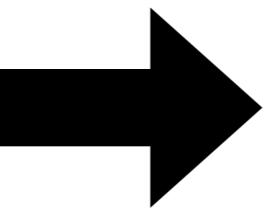
```

Correct? Efficient?

```

F ::= L
| F /\ F
| F \vee F

```



```

F ::= D | D /\ C
D ::= L | L \vee D

```

CNF

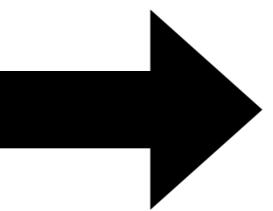
```

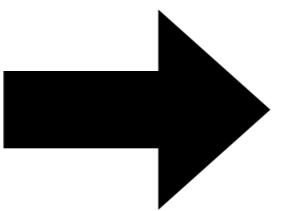
cnf f =
case f of
| 1 => 1
| (f1 /\ f2) \vee f3 => cnf ((f1 \vee f3) /\ (f2 \vee f3))
| f1 \vee (f2 /\ f3) => cnf ((f1 \vee f2) /\ (f1 \vee f3))
| f1 \vee f2 => (cnf f1) X (cnf f2)
| f1 /\ f2 => (cnf f1) /\ (cnf f2)

```

Correct? Efficient?

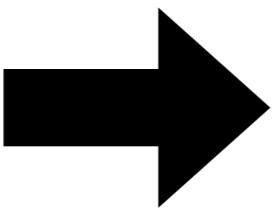


$$\begin{array}{l} F ::= L \\ | \quad F \wedge F \\ | \quad F \vee F \end{array}$$

$$\begin{array}{l} F ::= D \quad | \quad D \wedge C \\ D ::= L \quad | \quad L \vee D \end{array}$$

$$\begin{array}{l} F ::= L \\ | \quad F \wedge F \\ | \quad F \vee F \end{array}$$

$$\begin{array}{l} F ::= D \quad | \quad D \wedge C \\ D ::= L \quad | \quad L \vee D \end{array}$$

cnf $f =$

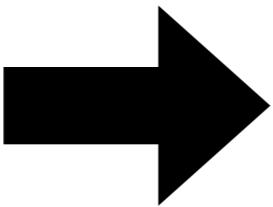
```
F ::= L  
| F /\ F  
| F \vee F
```



```
F ::= D | D /\ C  
D ::= L | L \vee D
```

```
cnf f =  
  case f of  
  | l => l
```

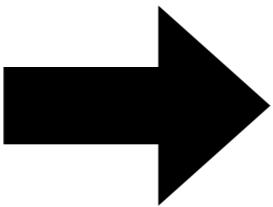
```
F ::= L  
| F /\ F  
| F \vee F
```



```
F ::= D | D /\ C  
D ::= L | L \vee D
```

```
cnf f =  
  case f of  
  | l => l  
  | f1 /\ f2 => (cnf f1) /\ (cnf f2)
```

```
F ::= L  
| F /\ F  
| F \vee F
```



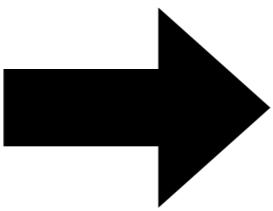
```
F ::= D | D /\ C  
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```

```
cnf f =  
  case f of  
  | l => l  
  | f1 /\ f2 => (cnf f1) /\ (cnf f2)  
  | f1 \vee f2 =>
```

```

F ::= L
| F /\ F
| F \vee F

```



```

F ::= D | D /\ C
D ::= L | L \vee D

```

```

cnf f =
  case f of
  | l => l
  | f1 /\ f2 => (cnf f1) /\ (cnf f2)
  | f1 \vee f2 =>
    (x1 \vee x2) /\ 
    (distr_or (~ x1) (cnf f1)) /\ 
    (distr_or (~ x2) (cnf f2))

```

F ::= L

F ::= D | D /\ C

(distr_or (\neg x) (($d_{1,1} \vee \dots \vee d_{1,k}$) $\wedge \wedge$
 $\dots \wedge \wedge$
($d_{m,1} \vee \dots \vee d_{m,n}$)) =

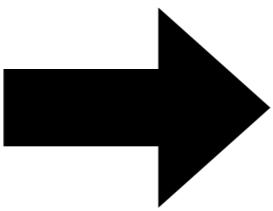
(($\neg x \vee d_{1,1} \vee \dots \vee d_{1,k}$) $\wedge \wedge$
 $\dots \wedge \wedge$
($\neg x \vee d_{m,1} \vee \dots \vee d_{m,n}$))

(x1) $\wedge \wedge$
(distr_or ($\neg x_1$) (cnf f1)) $\wedge \wedge$
(distr_or ($\neg x_2$) (cnf f2))

```

F ::= L
| F /\ F
| F \vee F

```



```

F ::= D | D /\ C
D ::= L | L \vee D

```

```

cnf f =
  case f of
  | l => l
  | f1 /\ f2 => (cnf f1) /\ (cnf f2)
  | f1 \vee f2 =>
    (x1 \vee x2) /\ 
    (distr_or (~ x1) (cnf f1)) /\ 
    (distr_or (~ x2) (cnf f2))

```

Resolution

$$C_a : (a_1 \vee a_2 \vee \dots \vee p \vee \dots \vee a_k)$$

$$C_b : (b_1 \vee b_2 \vee \dots \vee \neg p \vee \dots \vee b_n)$$

$$(a_1 \vee \dots \vee a_k \vee b_1 \vee \dots \vee b_n)$$

Unit Resolution

$C_a : p$

$C_b : (b_1 \vee b_2 \vee \dots \vee \neg p \vee \dots \vee b_n)$

$(b_1 \vee \dots \vee b_n)$

Unit Resolution

$$C_a : p$$
$$C_b : (b_1 \vee b_2 \vee \dots \vee \neg p \vee \dots \vee b_n)$$

$$(b_1 \vee \dots \vee b_n)$$

Intuition: modus ponens

$$p \wedge (p \rightarrow b_1 \vee \dots \vee b_n)$$

$$(b_1 \vee \dots \vee b_n)$$

Unit Resolution

$$C_a : p$$
$$C_b : (b_1 \vee b_2 \vee \dots \vee \neg p \vee \dots \vee b_n)$$

$$(b_1 \vee \dots \vee b_n)$$

Boolean Constraint Propagation

Unit Resolution

$$C_a : p$$
$$C_b : (b_1 \vee b_2 \vee \dots \vee \neg p \vee \dots \vee b_n)$$

$$(b_1 \vee \dots \vee b_n)$$

Boolean Constraint Propagation

```
bcp f =
  case pick_unit_clause f of
  | x => bcp (f[x ↦ ⊤])
  | NONE => f
```

Davis Putnam Logemann Loveland

```
dpll f =  
  f' = bcp f  
  case f' of  
  | T => SAT  
  | ⊥ => UNSAT  
  | _ =>  
    x = pick_var f'  
    if dpll f' [x ↦ T] = SAT then  
      SAT  
    else  
      dpll (f' [x ↦ ⊥])
```

Pure Literal Propagation

If a literal only occurs
positively, \top

If a literal only occurs
negatively, \perp

DPLL + PLP

```
dpll f =  
  f' = plp (bcp f)  
  case f' of  
  | T => SAT  
  | ⊥ => UNSAT  
  | _ =>  
    x = pick_var f'  
    if dpll f' [x ↦ T] = SAT then  
      SAT  
    else  
      dpll (f' [x ↦ ⊥])
```