

An Introduction to SMT Solvers and Their Applications (Part 2)

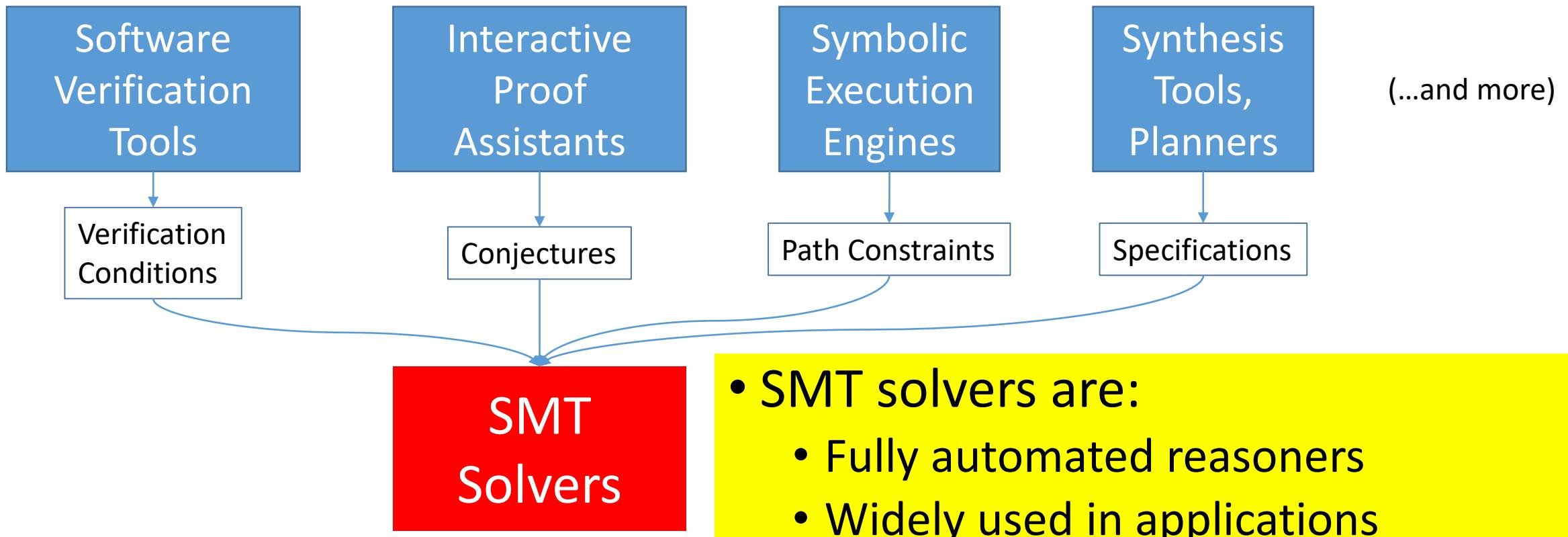
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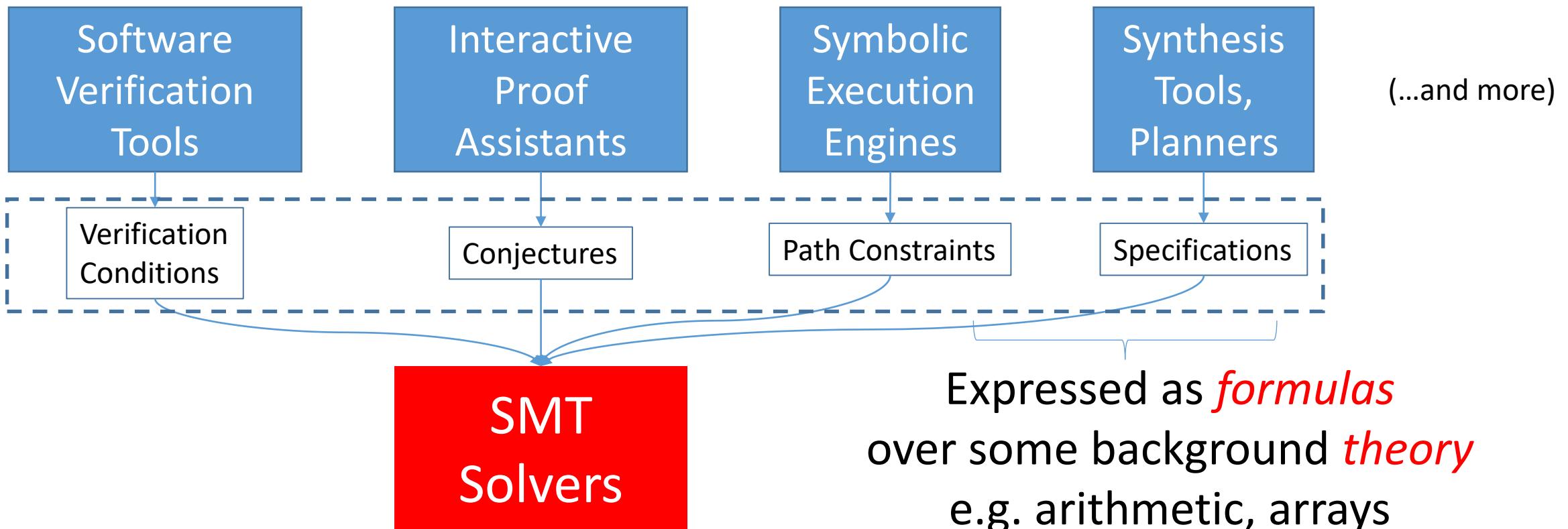
October 20, 2017



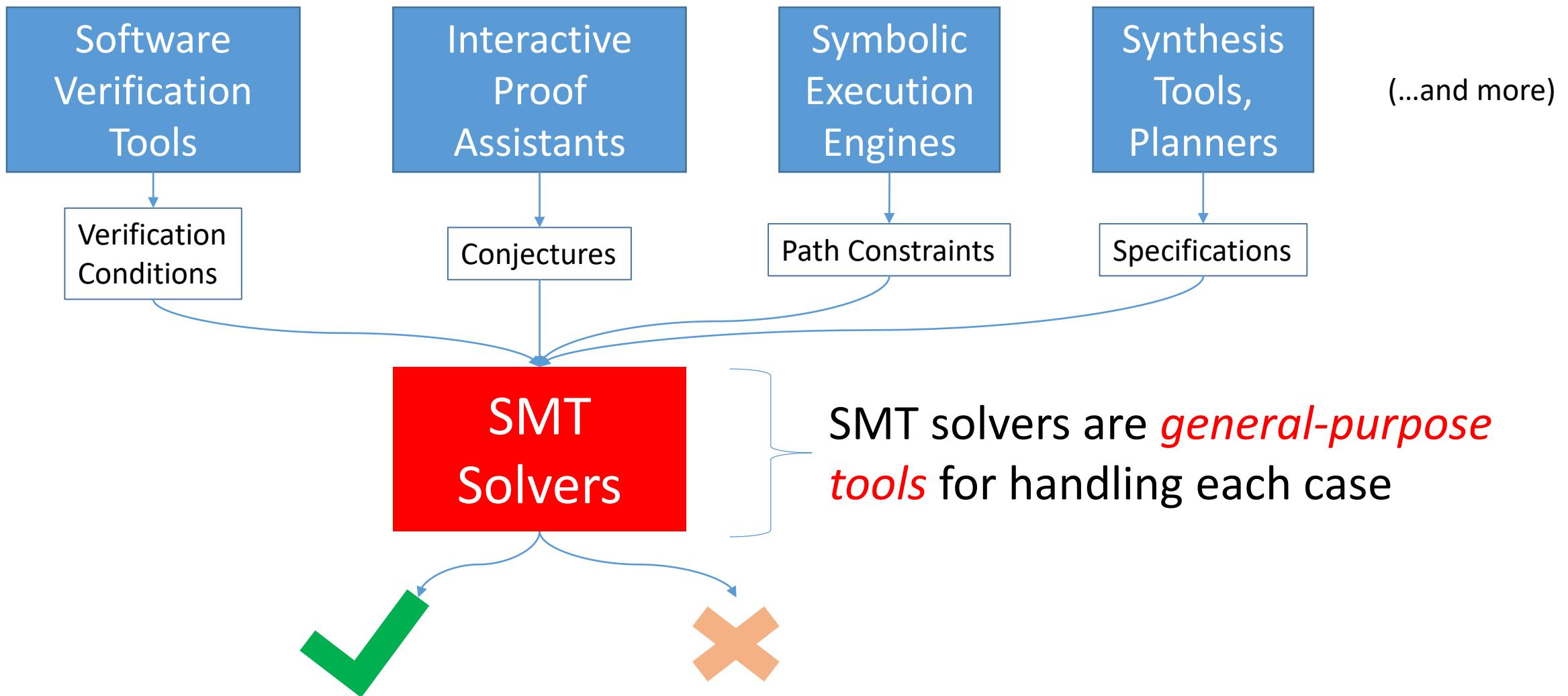
Satisfiability Modulo Theories (SMT) Solvers



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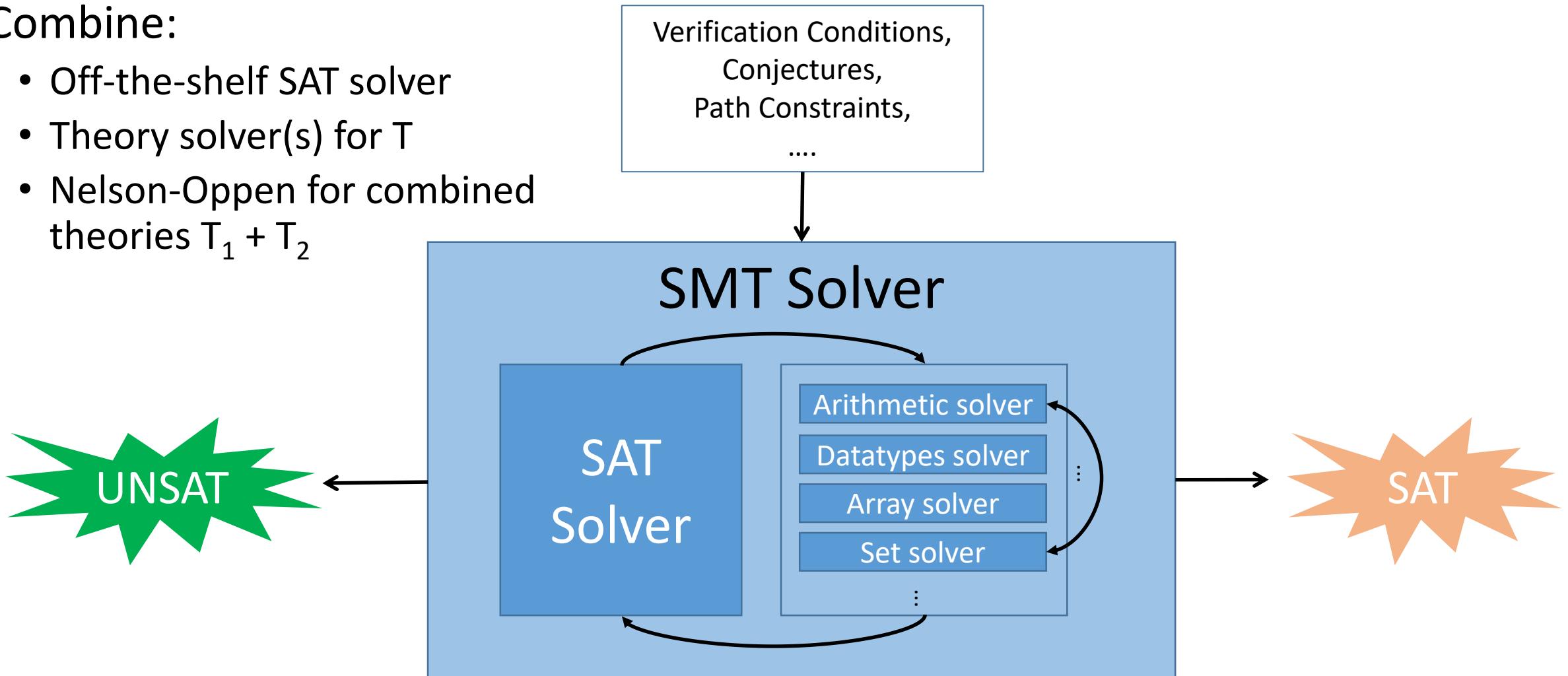


Satisfiability Modulo Theories (SMT) Solvers



In Part 1: DPLL(T)-Based SMT Solvers

- Combine:
 - Off-the-shelf SAT solver
 - Theory solver(s) for T
 - Nelson-Oppen for combined theories $T_1 + T_2$



In Part 2 : Decision Procedures

- *Decision procedures* in SMT solvers
 1. What is a decision procedure?
 2. What decision procedures are supported in SMT solvers?

Focus on: theory of *unbounded strings + length*

- Solving constraints in this theory
- Example problems

Constraints Supported by SMT Solvers

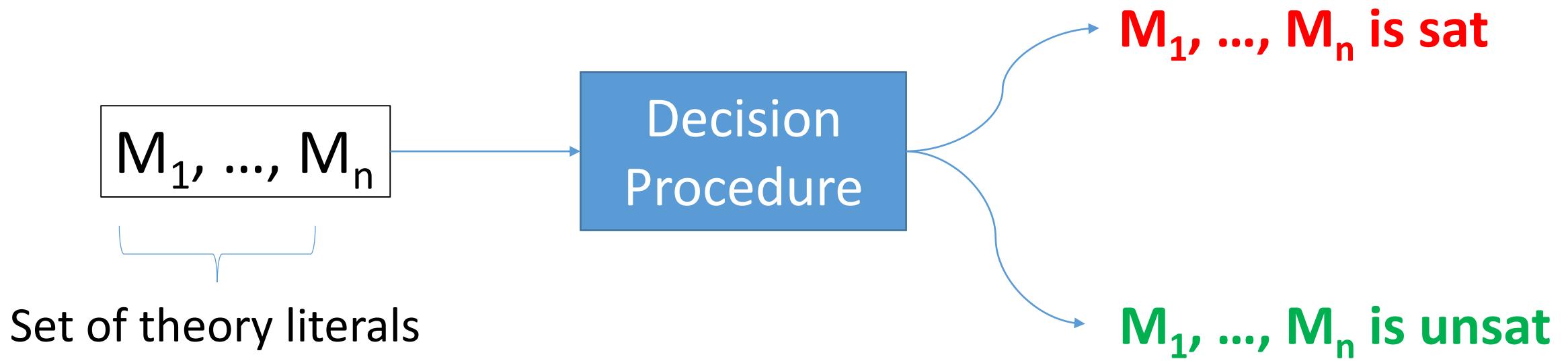
- SMT solvers support:
 - Arbitrary Boolean combinations of theory constraints
 - Examples of supported *theories*:
 - Uninterpreted functions: $f(a) = g(b, c)$
 - Linear real/integer arithmetic: $a \geq b + 2 * c + 3$
 - Arrays: $\text{select}(A, i) = \text{select}(\text{store}(A, i+1, 3), i)$
 - Bit-vectors: $\text{bvule}(x, \#xFF)$
 - Algebraic Datatypes: $x, y : \text{List}; \text{tail}(x) = \text{cons}(0, y)$
 - Unbounded Strings: $x, y : \text{String}; y = \text{substr}(x, 0, \text{len}(x) - 1)$
 - ...

Constraints Supported by SMT Solvers

- SMT solvers support:
 - Arbitrary Boolean combinations of theory constraints
 - Examples of supported theories ⇒ **decision procedures**
 - Uninterpreted functions: ⇒ Congruence Closure [[Nieuwenhuis/Oliveras 2005](#)]
 - Linear real/integer arithmetic: ⇒ Simplex [[deMoura/Dutertre 2006](#)]
 - Arrays: ⇒ [[deMoura/Bjorner 2009](#)]
 - Bit-vectors: ⇒ Bitblasting, lazy approaches [[Bruttomesso et al 2007, Hadarean et al 2014](#)]
 - Algebraic Datatypes: ⇒ [[Barrett et al 2007, Reynolds/Blanchette 2015](#)]
 - Unbounded Strings: ⇒ [[Zheng et al 2013, Liang et al 2014, Abdulla et al 2014](#)]
 - ...

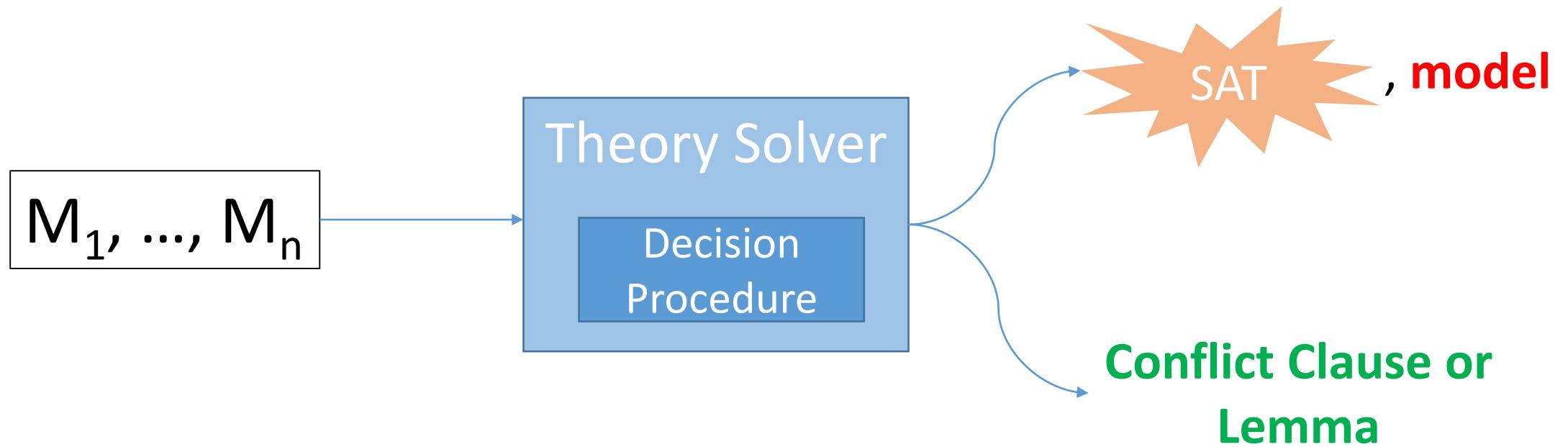
Decision Procedures in DPLL(T)

- A *decision procedure* has the following interface:



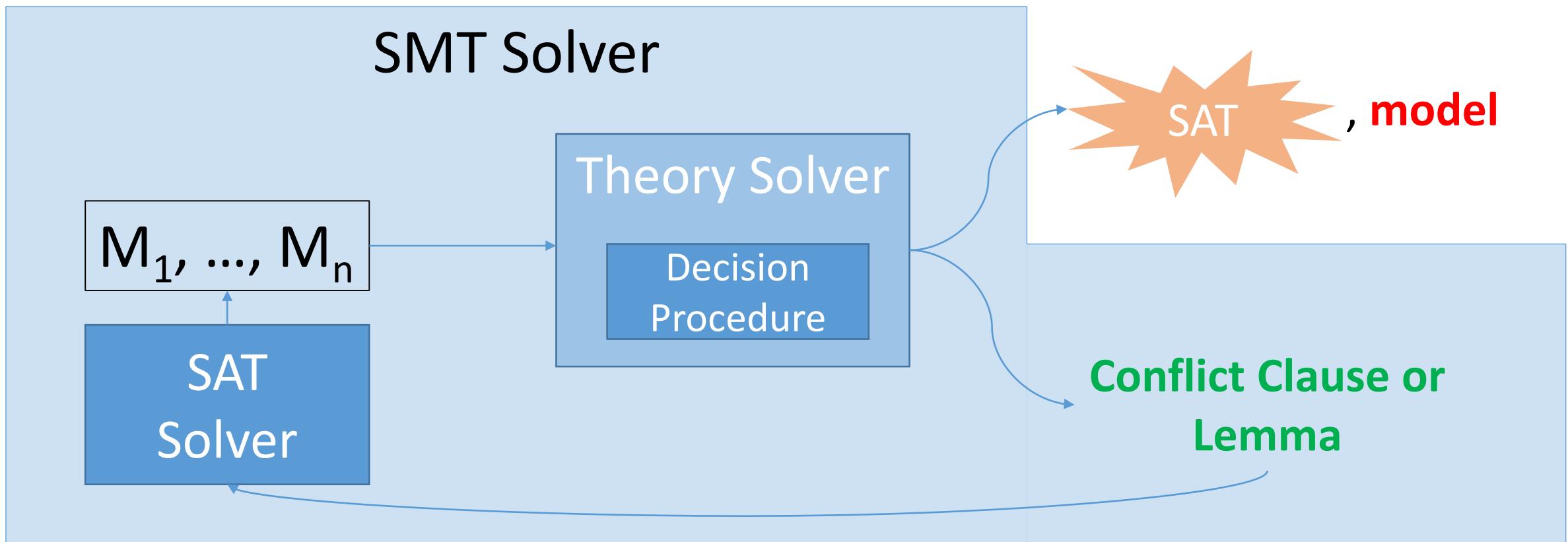
Decision Procedures in DPLL(T)

- SMT solvers use *theory solvers* that implement decision procedures:



Decision Procedures in DPLL(T)

- Theory solvers are integrated in the *DPLL(T)* loop:



DPLL(T) Theory Solvers

- **Input** : A set of T-literals M
- **Output** : either
 1. M is T-satisfiable
 2. $\{l_1, \dots, l_n\} \subseteq M$ is T-unsatisfiable
 3. Don't know

DPLL(T) Theory Solvers

- Input : A set of T-literals M
- Output : either
 1. M is **T-satisfiable**
 - Return *model*, e.g. { $x \rightarrow 2$, $y \rightarrow 3$, $z \rightarrow -3$ } for { $x < y$, $y + z = 0$ }
 - ⇒ Should be **solution-sound**
 - Answers “M is T-satisfiable” only if M is T-satisfiable
 2. $\{ l_1, \dots, l_n \} \subseteq M$ is T-unsatisfiable
 3. Don’t know

DPLL(T) Theory Solvers

- Input : A set of T-literals M
- Output : either
 1. M is T-satisfiable
 - Return *model*, e.g. $\{x \rightarrow 2, y \rightarrow 3, z \rightarrow -3\}$ for $\{x < y, y + z = 0\}$
⇒ Should be *solution-sound*
 - Answers “M is T-satisfiable” only if M is T-satisfiable
 2. $\{l_1, \dots, l_n\} \subseteq M$ is **T-unsatisfiable**
 - Return *conflict* clause, e.g. $(x < 0 \vee \neg x = 3)$ for $\{\neg x < 0, x = 3\}$
⇒ Should be *refutation-sound*
 - Answers “ $\{l_1, \dots, l_n\}$ is T-unsatisfiable” only if $\{l_1, \dots, l_n\}$ is T-unsatisfiable
 3. Don’t know

DPLL(T) Theory Solvers

- Input : A set of T-literals M
- Output : either
 1. M is T-satisfiable
 - Return *model*, e.g. $\{x \rightarrow 2, y \rightarrow 3, z \rightarrow -3\}$ for $\{x < y, y + z = 0\}$
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⇒ Should be *refutation-sound*
 - Answers “ $\{l_1, \dots, l_n\}$ is T-unsatisfiable” only if $\{l_1, \dots, l_n\}$ is T-unsatisfiable
 3. **Don't know**
 - Return lemma, e.g. split on $(x = y \vee \neg x = y)$

DPLL(T) Theory Solvers

- Input : A set of T-literals M
- Output : either
 1. M is T-satisfiable
 - Return *model*, e.g. $\{x \rightarrow 2, y \rightarrow 3, z \rightarrow -3\}$ for $\{x < y, y + z = 0\}$
⇒ Should be *solution-sound*
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 2. $\{l_1, \dots, l_n\} \subseteq M$ is T-unsatisfiable
 - Return *conflict* clause, e.g. $(x < 0 \vee \neg x = 3)$ for $\{\neg x < 0, x = 3\}$
⇒ Should be *refutation-sound*
 - Answers “ $\{l_1, \dots, l_n\}$ is T-unsatisfiable” only if $\{l_1, \dots, l_n\}$ is T-unsatisfiable
 3. Don’t know
 - Return lemma, e.g. split on $(x = y \vee \neg x = y)$
- ⇒ If solver is solution-sound, refutation-sound, and *terminating*,
 - Then it implements a *decision procedure* for T

Theory Solvers: Linear Arithmetic

Linear Arithmetic

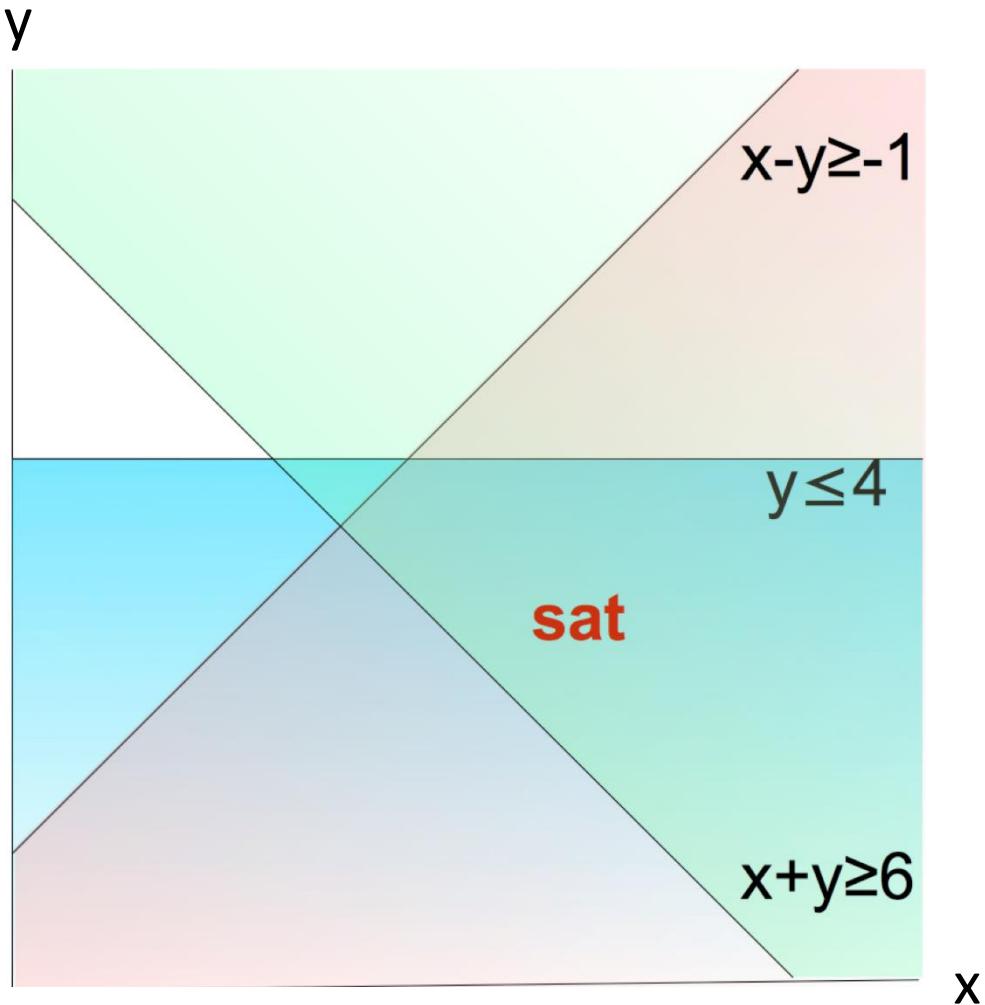
- Quantifier-free linear real and integer arithmetic
QF_LRA, QF_LIA, QF_LIRA
- Given the linear inequalities

$$\begin{aligned}x &: \text{Real}; y : \text{Real}; \\x - y &\geq -1, \quad y \leq 4, \quad x + y \geq 6\end{aligned}$$

is there an assignment to x and y that makes all of them true?

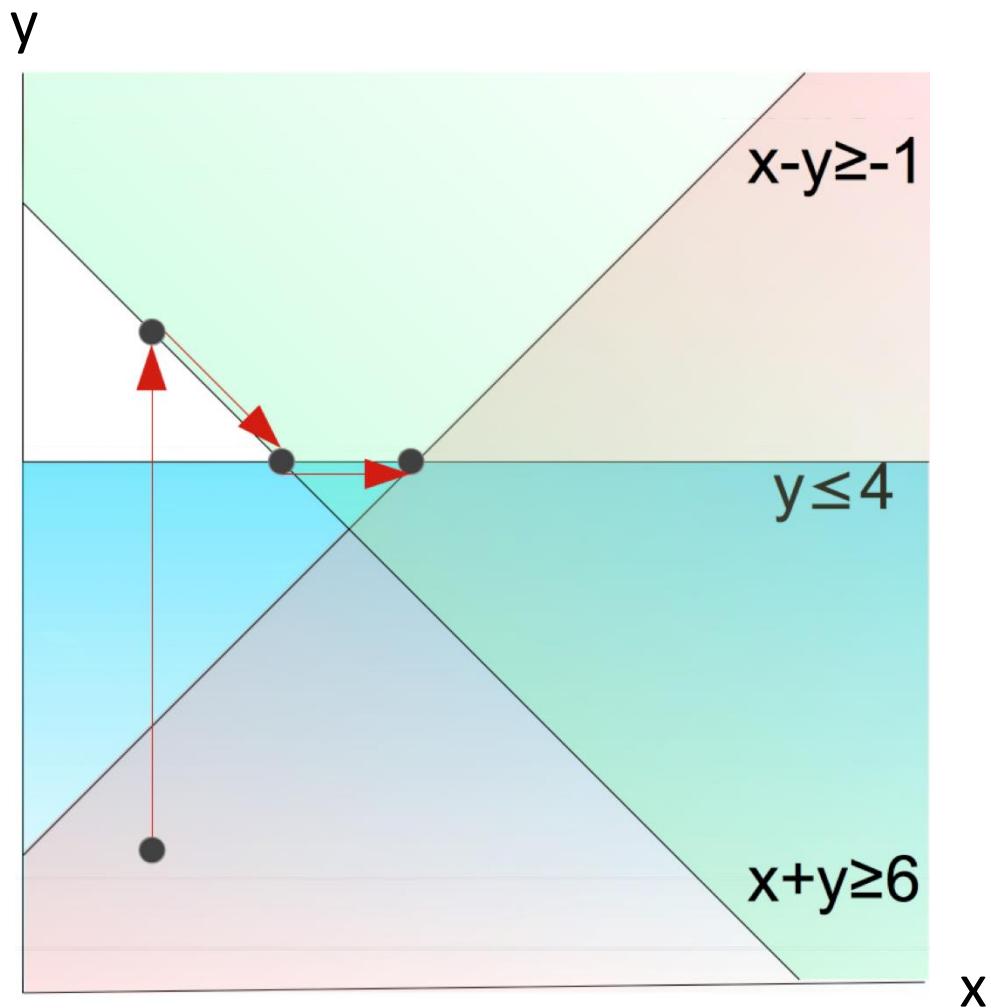
- Solve using simplex-based approaches [\[Dutertre/de Moura 2006\]](#)

Simplex Search



Is an intersection of
half planes empty?

Simplex Search



From Reals to (Mixed) Integers

- Add `isInt(x)` constraints
- First solve real relaxation
 - Ignore `isInt(x)` constraints
- If real relaxation is sat:
 - Check if current assignment $M(x)$ satisfies `isInt(x)` constraints
 - If not, refine by branching [Dillig 2006, Griggio 2012, Jovanovic/de Moura 2013]

$\text{isInt}(x) \wedge M(x) = 1$...
 $\text{isInt}(x) \wedge M(x) = 1.5$...
 $\text{isInt}(x) \wedge M(x) = 2$...



Add lemma ($x \geq 2 \vee x \leq 1$)



Theory Solvers: Equality + Uninterpreted Functions (EUF)

Theory of Uninterpreted Functions (UF)

- Equalities and disequalities between terms built from UF, e.g.

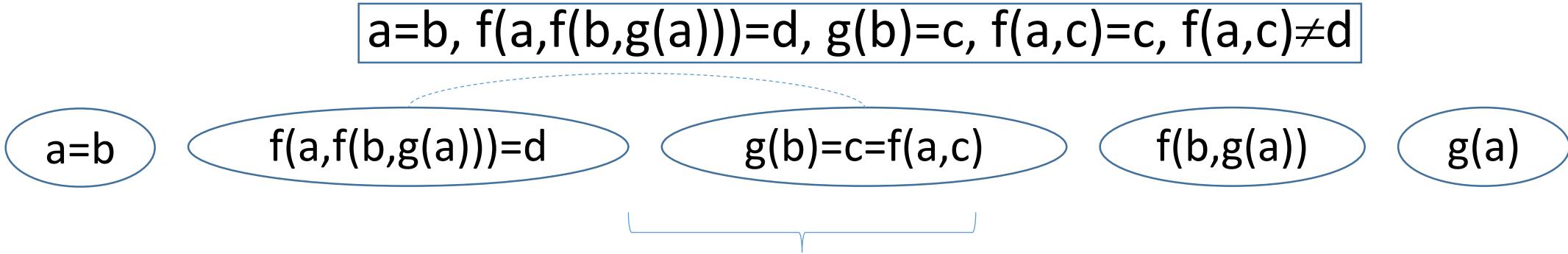
$$a=b, f(a,f(b,g(a)))=d, g(b)=c, f(a,c)=c, f(a,c)\neq d$$

...where signature is:

“uninterpreted sort” U
a,b,c,d : U
g : U → U
f : U × U → U

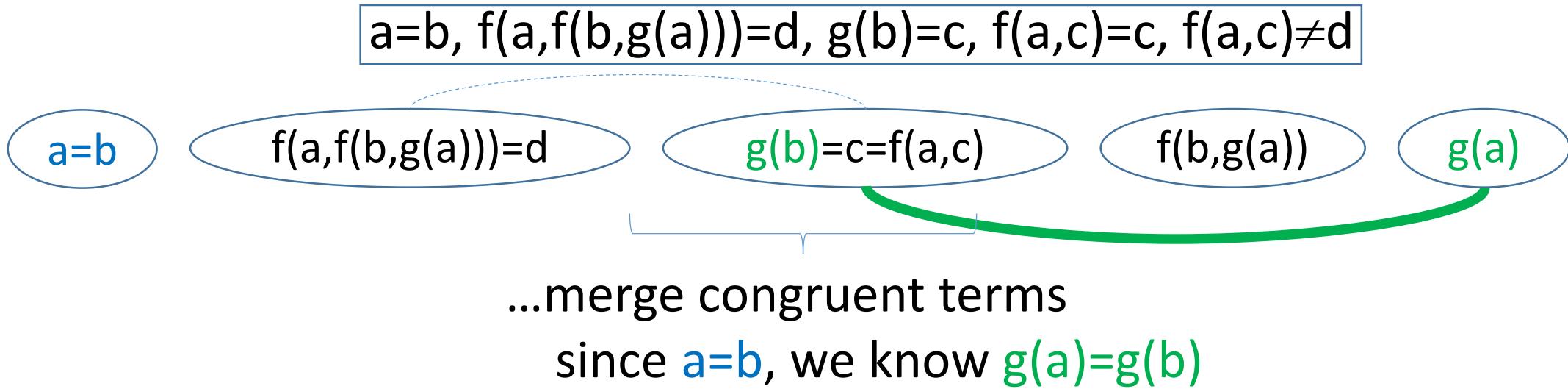
⇒ UF are useful for abstracting processes, other symbols
not natively supported by solver

Congruence Closure



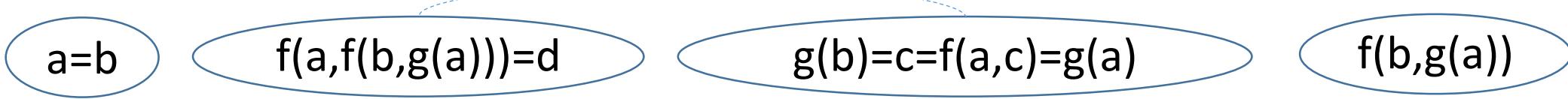
Compute *equivalence classes* of all (sub)terms

Congruence Closure

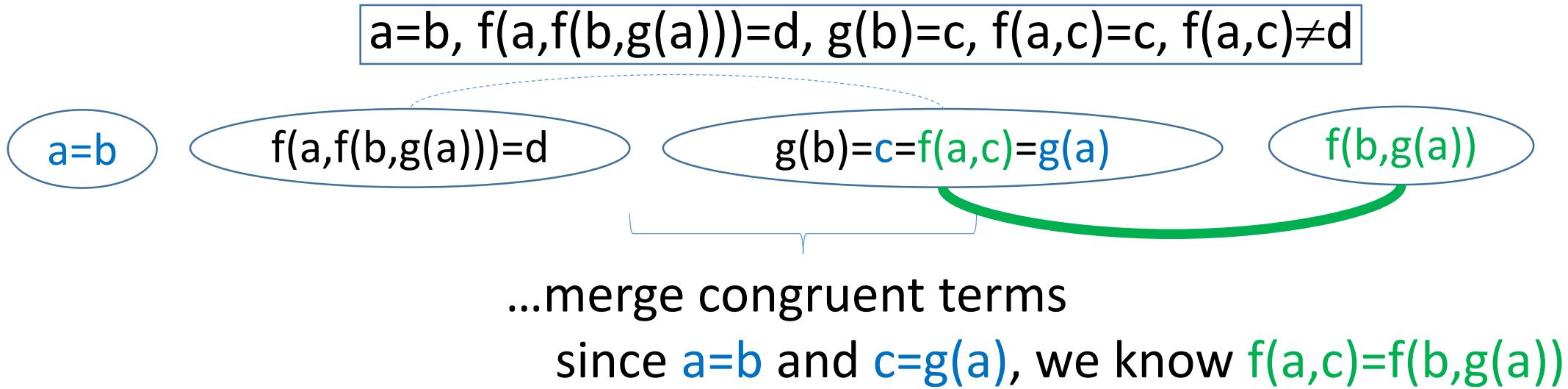


Congruence Closure

$a=b, f(a, f(b, g(a)))=d, g(b)=c, f(a, c)=c, f(a, c) \neq d$



Congruence Closure



Congruence Closure

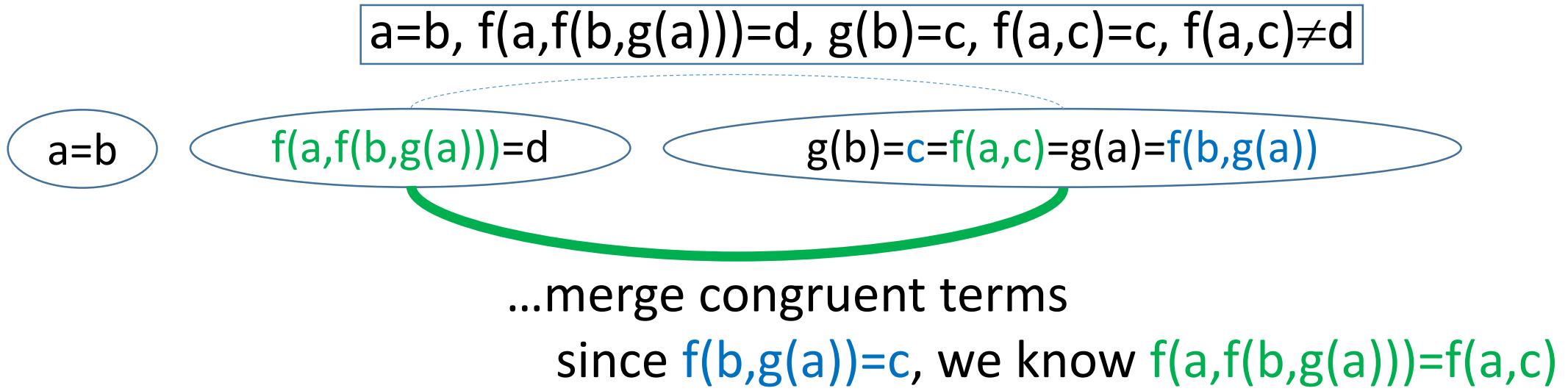
$a=b, f(a, f(b, g(a)))=d, g(b)=c, f(a, c)=c, f(a, c) \neq d$

$a=b$

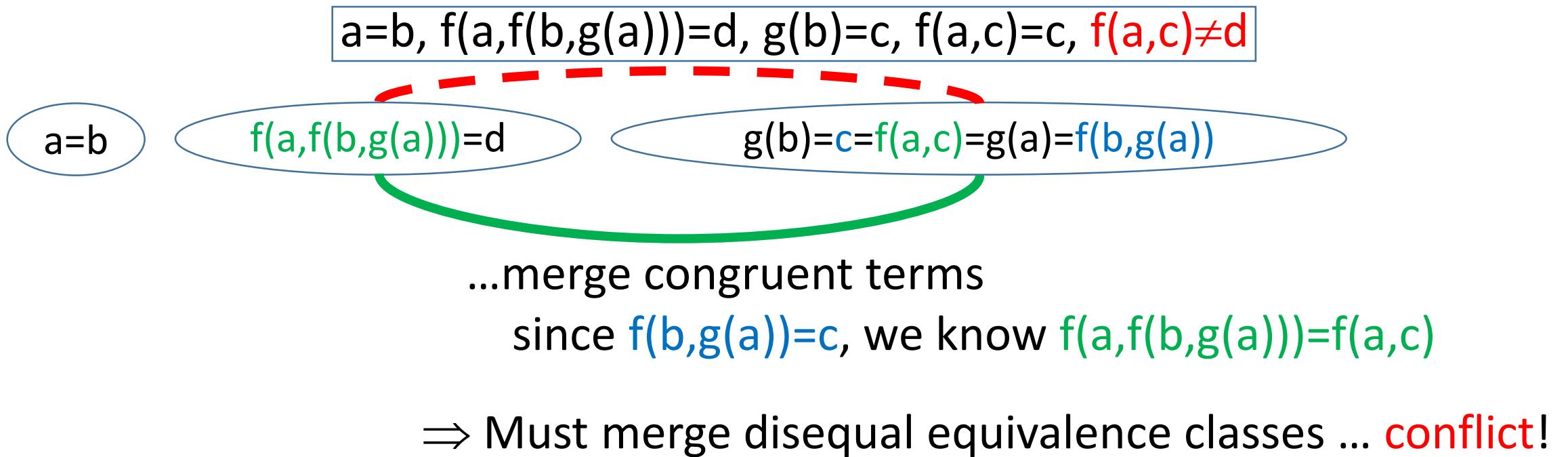
$f(a, f(b, g(a)))=d$

$g(b)=c=f(a, c)=g(a)=f(b, g(a))$

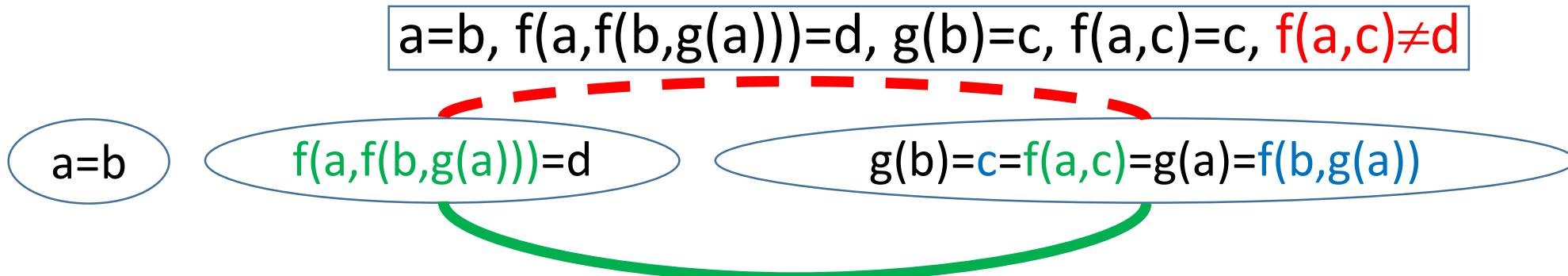
Congruence Closure



Congruence Closure



Congruence Closure



...merge congruent terms
since $f(b,g(a))=c$, we know $f(a,f(b,g(a)))=f(a,c)$

⇒ Must merge disequal equivalence classes ... **conflict!**

Congruence closure is important building block for many decision procedures

Theory Solvers: Arrays

Arrays : Signature Σ

Types:

(**Array** $T_1 T_2$) : Arrays with index type T_1 , element type T_2

Operators:

(**store** $a i v$) : Array obtained by writing v at index i in Array a

(**select** $a i$) : Element at index i of Array a

⇒ Arrays are useful for modelling memory, data structures

Procedure for Arrays with Extensionality

i=j, select(A,i)≠select(store(A,k,5),j),j≠k

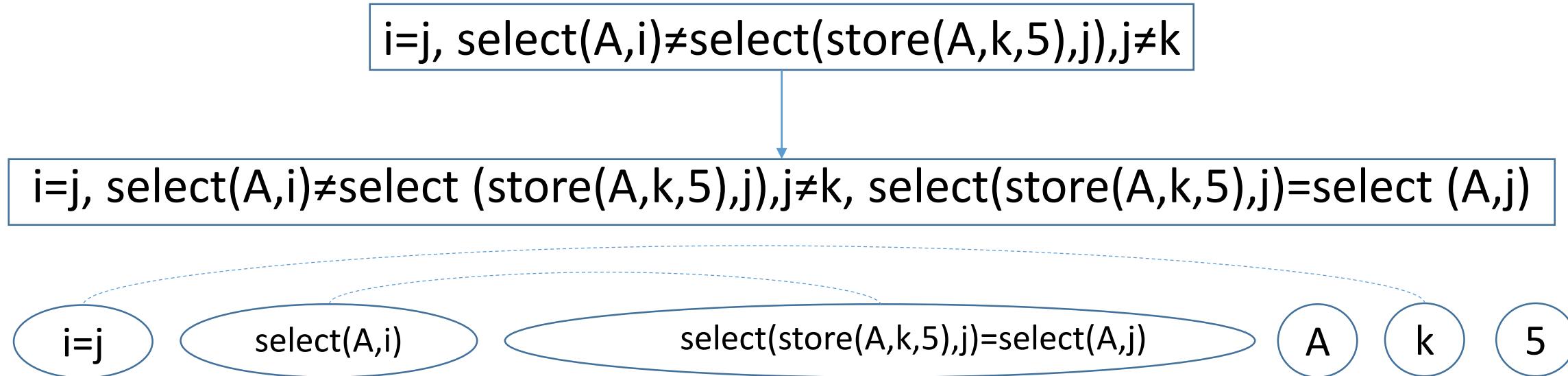
Procedure for Arrays with Extensionality

$i=j, \text{select}(A,i) \neq \text{select}(\text{store}(A,k,5),j), j \neq k$

(read over write)

$i=j, \text{select}(A,i) \neq \text{select}(\text{store}(A,k,5),j), j \neq k, \text{select}(\text{store}(A,k,5),j) = \text{select}(A,j)$

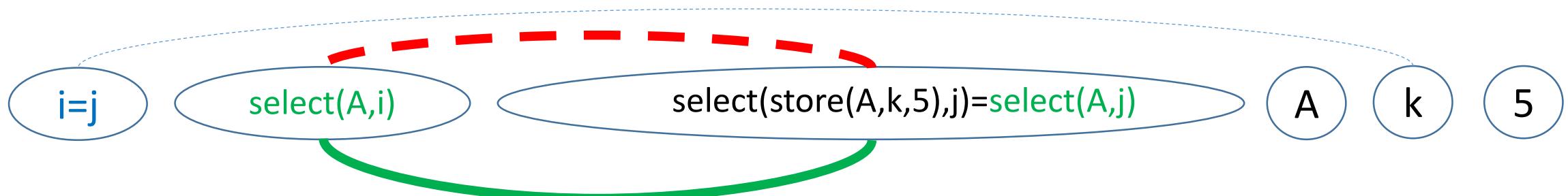
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...merge congruent terms

since $i=j$, we know $\text{select}(A,i) = \text{select}(A,j)$
conflict!

Theory Solvers: Bitvectors

Bit Vectors

- Bit-vectors parameterized by a bit-width

(`_ BitVec 2`) : #b00,#b01,#b10,#b11

(`_ BitVec 10`) : #b0000000000,#b0101010101,#b1111111110,...

...

- For each bit-width, large signature containing operators for:
 - (Modular) arithmetic
 - Bitwise logical operations
 - Bit-shifting
 - Concatenation/extraction

⇒ Bit-vectors are useful for modelling machine integers, circuits

SMT-LIB Bitvectors

(_ BitVec *n*)

(concat *s t*)

(bvnot *s*)

(_ #bv*X n*)

((_ extract *i j*) *s*)

(bvand *s t*)

#b*X*

((_ repeat *i*) *s*)

(bvnand *s t*)

#x*X*

((_ zero_extend *i*) *s*)

(bvor *s t*)

(bvshl *s t*)

((_ sign_extend *i*) *s*)

(bvnor *s t*)

(bvlshr *s t*)

((_ rotate_left *i*) *s*)

(bvxor *s t*)

(bvashr *s t*)

((_ rotate_right *i*) *s*)

(bvxnor *s t*)

SMT-LIB Bitvectors

(**bvneg** s)

(**bvadd** s t)

(**bvsub** s t)

(**bvmul** s t)

(**bvudiv** s t)

(**bvurem** s t)

(**bvsdiv** s t)

(**bvsrem** s t)

(**bvsmod** s t)

(**bvcomp** s t)

(**bvult** s t)

(**bvule** s t)

(**bvugt** s t)

(**bvuge** s t)

(**bvslt** s t)

(**bvsle** s t)

(**bvsgt** s t)

(**bvsge** s t)

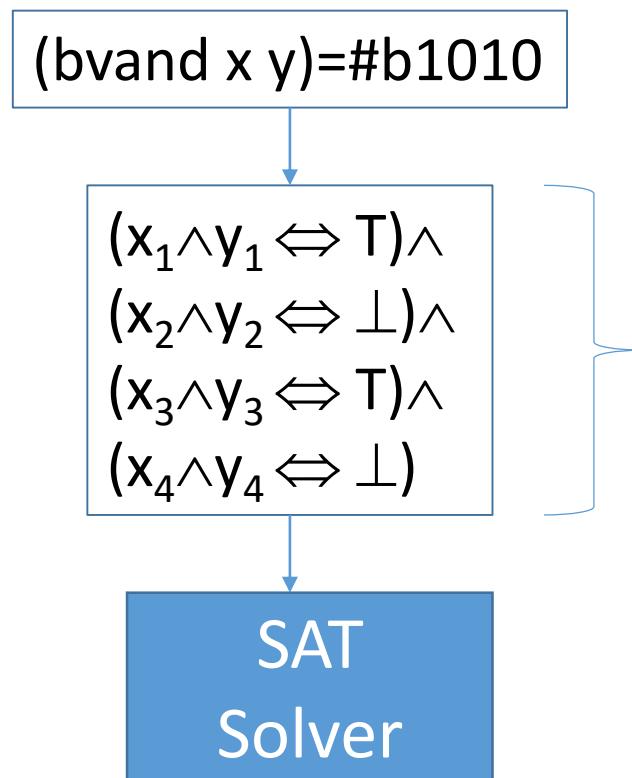
Solving Bit Vectors

- Typically, bit-vector constraints are solved by bit-blasting
 ⇒ Eager reduction to propositional satisfiability
- For example:

$$(bvand\ x\ y)=\#b1010$$

Solving Bit Vectors

- For example:



Relies on developing good encodings
for each operator in bit-vector signature

Solving Bit Vectors

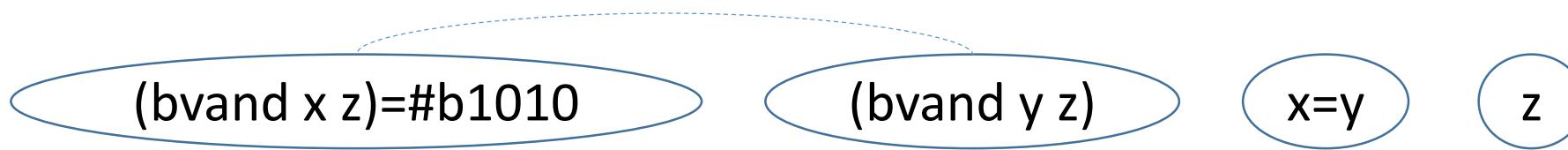
- Bit-blasting can also be done **lazily** [Bruttomesso et al 2007, Hadarean et al 2014]
- Instead of: $(\text{bvand } x \text{ } z) = \#b1010, (\text{bvand } y \text{ } z) \neq \#b1010, x = y$



$$\begin{aligned} & (x_1 \wedge z_1 \Leftrightarrow T) \wedge (y_1 \wedge z_1 \Leftrightarrow T) \wedge (x_1 \Leftrightarrow y_1) \wedge \\ & (x_2 \wedge z_2 \Leftrightarrow \perp) \wedge (y_2 \wedge z_2 \Leftrightarrow \perp) \wedge (x_2 \Leftrightarrow y_2) \wedge \\ & (x_3 \wedge z_3 \Leftrightarrow T) \wedge (y_3 \wedge z_3 \Leftrightarrow \perp) \wedge (x_3 \Leftrightarrow y_3) \wedge \\ & (x_4 \wedge z_4 \Leftrightarrow \perp) \wedge (y_4 \wedge z_4 \Leftrightarrow T) \wedge (x_4 \Leftrightarrow y_4) \end{aligned}$$

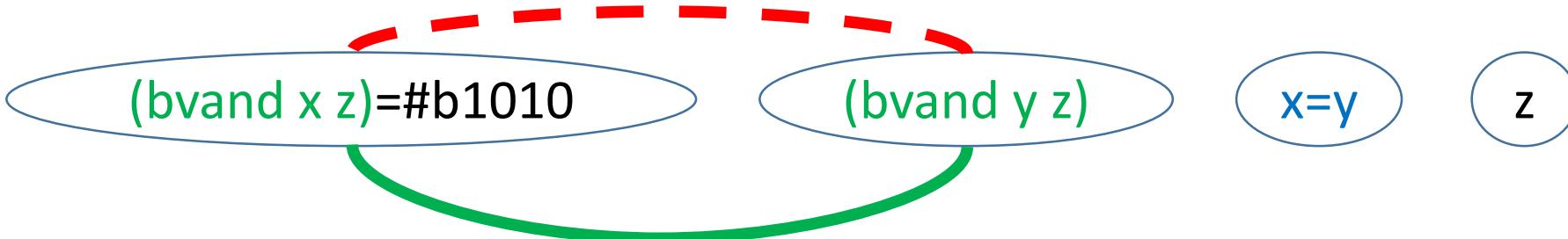
Solving Bit Vectors

$(\text{bvand } x \text{ } z) = \#b1010, (\text{bvand } y \text{ } z) \neq \#b1010, x = y$



Solving Bit Vectors

$$(bvand \ x \ z) = \#b1010, (bvand \ y \ z) \neq \#b1010, x=y$$



...merge congruent terms

since $x=y$, we know $(bvand \ x \ z) = (bvand \ y \ z)$

\Rightarrow **Conflict**, before resorting to bit-blasting

Theory Solvers: Finite Sets + Cardinality

Theory of Finite Sets + Cardinality

- Parametric theory of finite sets of elements T
- Signature Σ_{Set} :
 - Empty set \emptyset , Singleton $\{a\}$
 - Membership $\in : T \times Set(T) \rightarrow \text{Bool}$
 - Subset $\subseteq : Set(T) \times Set(T) \rightarrow \text{Bool}$
 - Set connectives $\cup, \cap, \setminus : Set(T) \times Set(T) \rightarrow Set(T)$
- Example input:

$$x = y \cap z \wedge a + 5 \in x \wedge y \subseteq w$$

⇒ Sets are important in databases, knowledge representation, programming languages, e.g. Alloy

Theory of Finite Sets + Cardinality

- Extended signature of theory to include:
 - **Cardinality** $|.| : \text{Set} \rightarrow \text{Int}$
- Extended **decision procedure** for cardinality constraints
[Bansal et al IJCAR2016]
- Example input:

$x = y \cup z \wedge |x| = 14 \wedge |y| \geq |z| + 5$

Extended to Theory of Finite Relations [Meng et al 2017]

⇒ *Relations* $\text{Rel}(\alpha)$ can be modeled as a *set of tuples* $\text{Set}(\text{Tup}(\alpha))$

Tuple constructor:

$$\langle _, _, _ \rangle : \alpha_1 \times \cdots \times \alpha_n \rightarrow \text{Tup}_n(\alpha_1, \dots, \alpha_n)$$

Product: $* : \text{Rel}_m(\alpha) \times \text{Rel}_n(\beta) \rightarrow \text{Rel}_{m+n}(\alpha, \beta)$

Join: $\bowtie : \text{Rel}_{p+1}(\alpha, \gamma) \times \text{Rel}_{q+1}(\gamma, \beta) \rightarrow \text{Rel}_{p+q}(\alpha, \beta)$
with $p + q > 0$

Transpose: $_{}^{-1} : \text{Rel}_m(\alpha_1, \dots, \alpha_m) \rightarrow \text{Rel}_m(\alpha_m, \dots, \alpha_1)$

Transitive Closure: $_{}^+ : \text{Rel}_2(\alpha, \alpha) \rightarrow \text{Rel}_2(\alpha, \alpha)$

Theory Solvers: Strings

Basic String Constraints

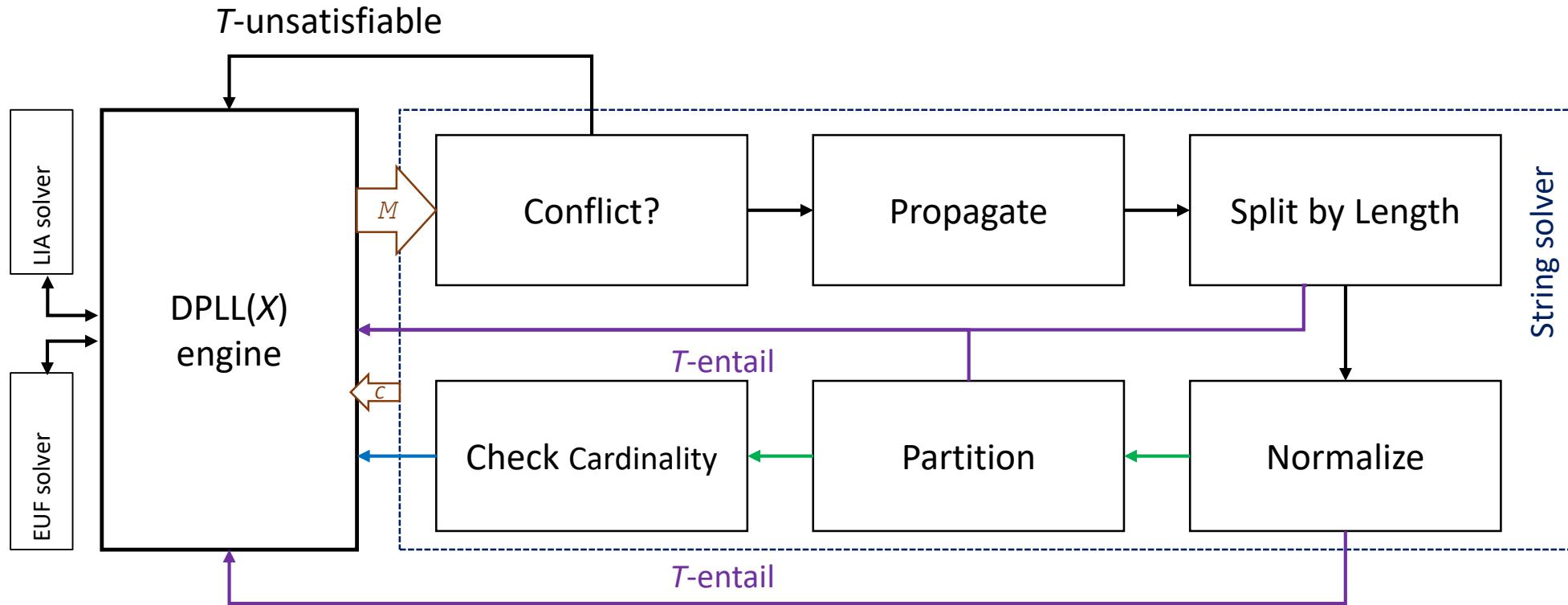
- Equalities and disequalities between *string terms* :
 - Variables: x
 - String constants: "abc"
 - Concatenation: $x \cdot "abc"$
 - Length: $|x|$
- *Linear arithmetic constraints*: $|x| + 4 > |y|$

Example: $x \cdot "a" = y \wedge |y| > |x| + 2$

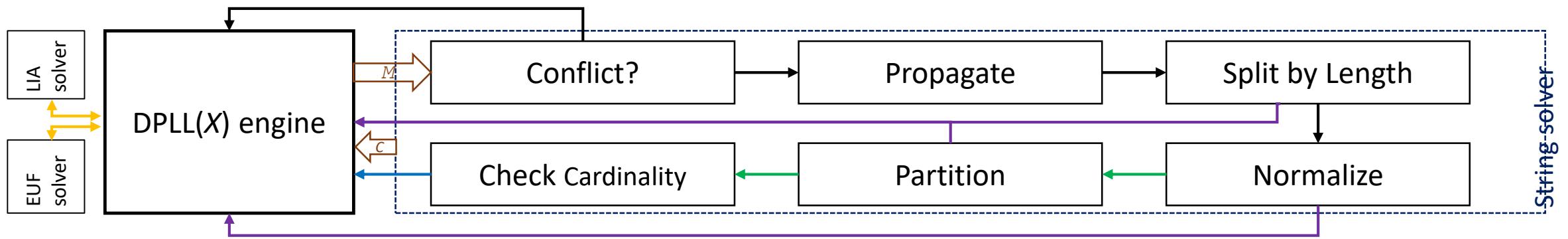
Procedures in [Abdulla et al CAV2014, Liang et al CAV2014]

⇒ Strings are important in security applications, e.g. for detecting attack vulnerabilities

General String Solver Architecture



DPLL(T): Find Satisfying Assignment



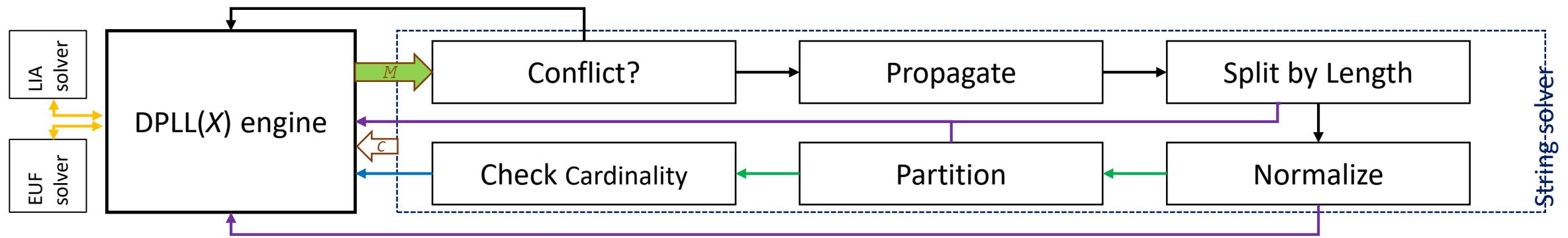
$$\begin{aligned} & |x| > |y| \\ & (x \cdot z = y \cdot w \cdot "ab" \vee x = y) \end{aligned}$$

SAT
Solver

Arithmetic
Solver

String
Solver

DPLL(T): Find Satisfying Assignment

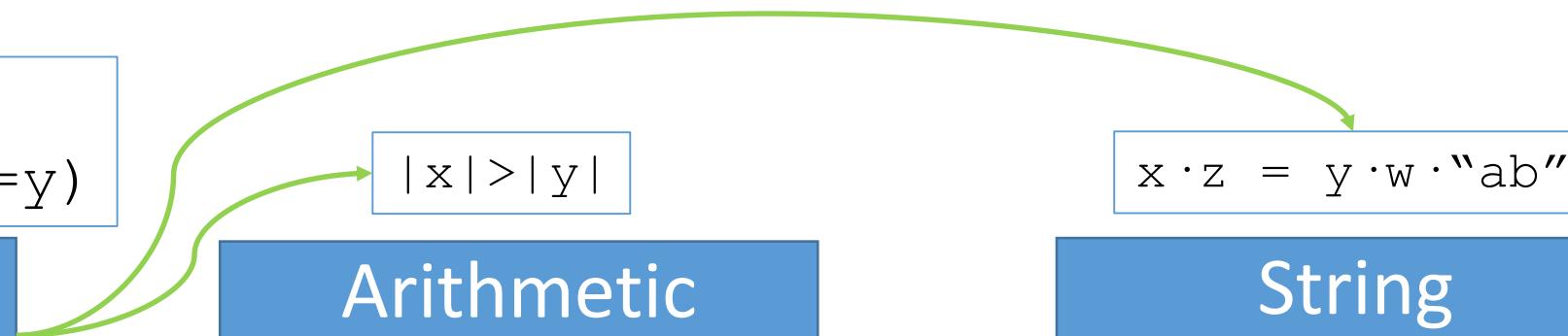


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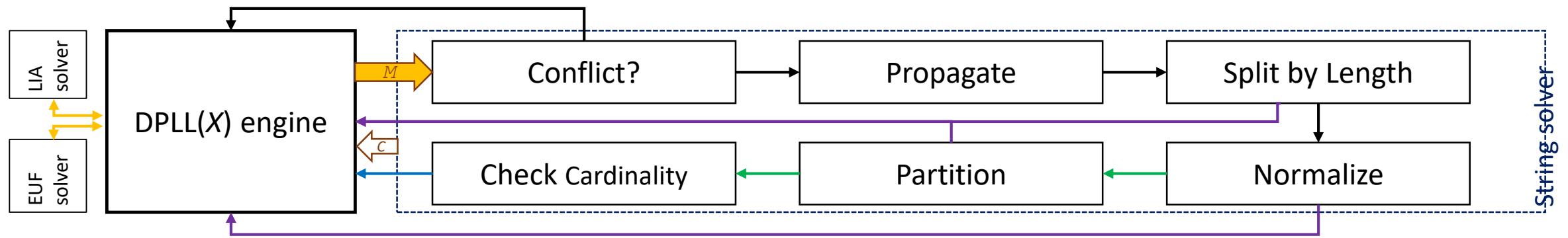
SAT
Solver

Arithmetic
Solver

String
Solver



DPLL(T): Find Satisfying Assignment



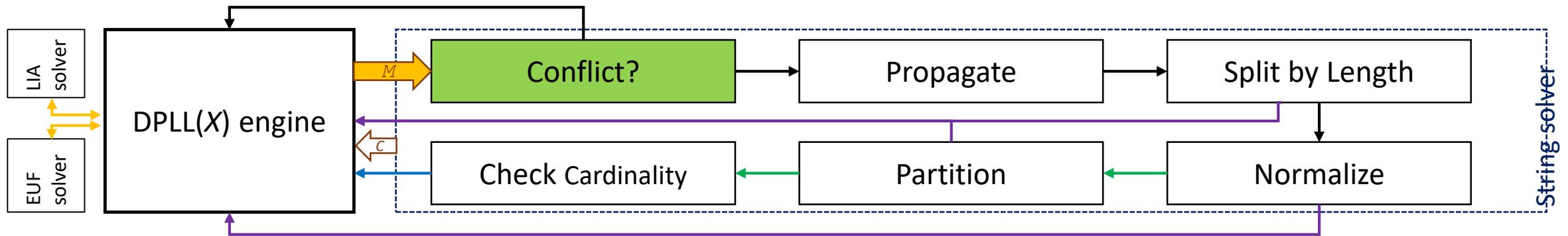
$$|x| > |y|$$

Arithmetic
Solver

$$x \cdot z = y \cdot w \cdot "ab"$$

String
Solver

Conflict Checking

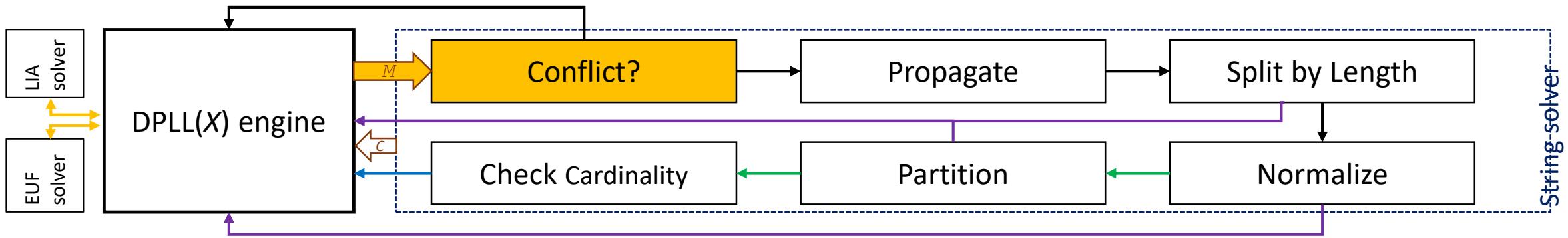


Arithmetic
Solver

String
Solver

- String context contains dis-equalities like: $\text{x} \neq \text{x}$
- Arithmetic context contains a contradiction: $|x| < |y| < |x|$

Conflict Checking



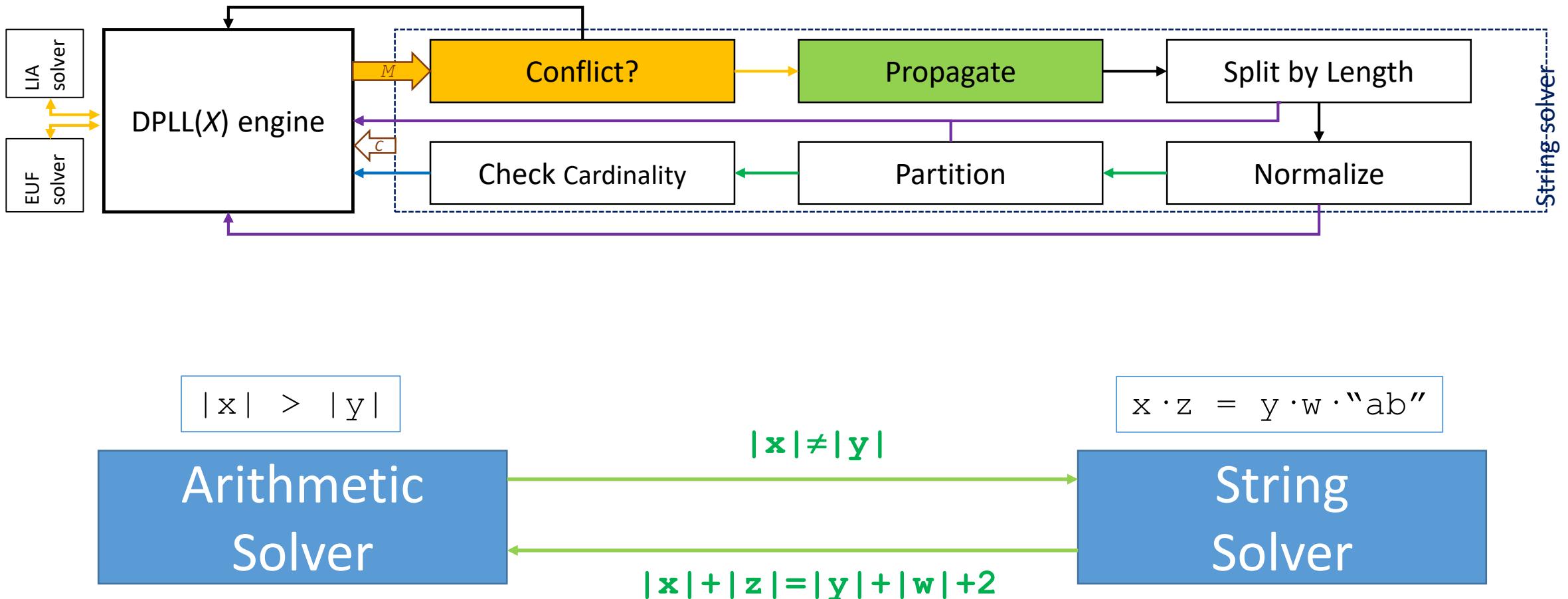
$$|x| > |y|$$

$$x \cdot z = y \cdot w \cdot "ab"$$

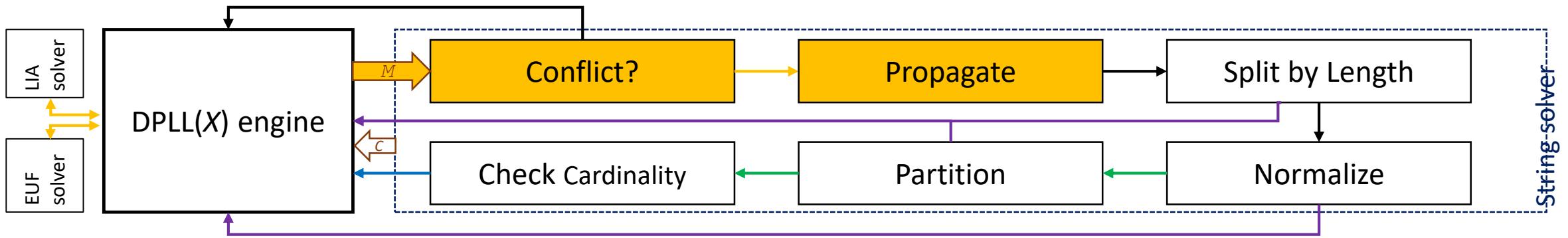
Arithmetic
Solver

String
Solver

Shared Term Propagation



Shared Term Propagation



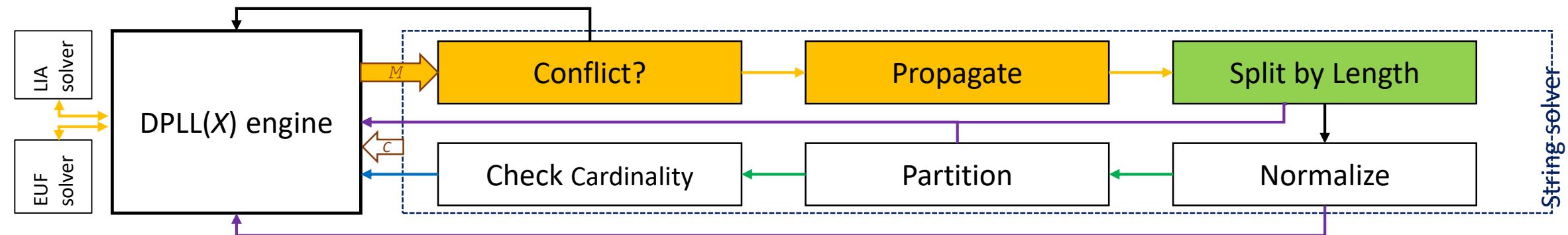
$$\begin{aligned}|x| + |z| &= |y| + |w| + 2 \\ |x| &> |y|\end{aligned}$$

Arithmetic
Solver

$$\begin{aligned}|x| &\neq |y| \\ x \cdot z &= y \cdot w \cdot "ab"\end{aligned}$$

String
Solver

Length Splitting



$$\begin{aligned} |x| + |z| &= |y| + |w| + 2 \\ |x| &> |y| \end{aligned}$$

$$\begin{aligned} |x| &\neq |y| \\ x \cdot z &= y \cdot w \cdot "ab" \end{aligned}$$

Arithmetic Solver

$$\begin{aligned} |x| &= 0 \\ |y| &= 0 \\ \dots \end{aligned}$$

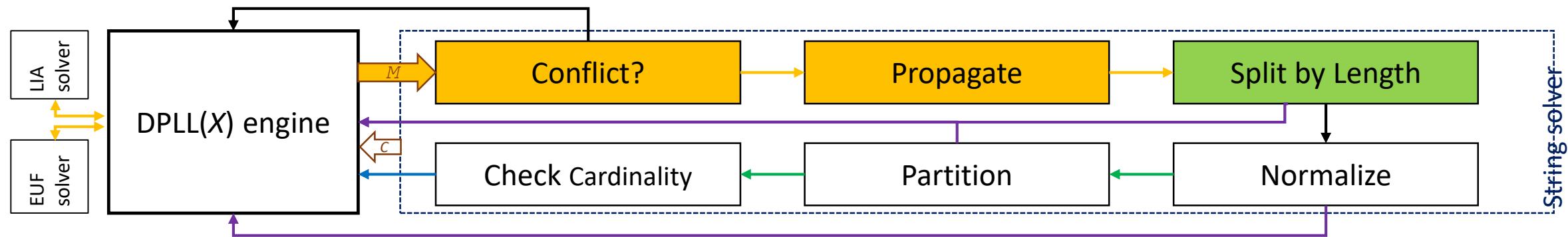
$$\begin{aligned} |x| &= 0 \\ |y| &> 0 \\ \dots \end{aligned}$$

$$\begin{aligned} |x| &> 0 \\ |y| &= 0 \\ \dots \end{aligned}$$

String Solver

$$\begin{aligned} |x| &> 0 \\ |y| &> 0 \\ \dots \end{aligned}$$

Length Splitting



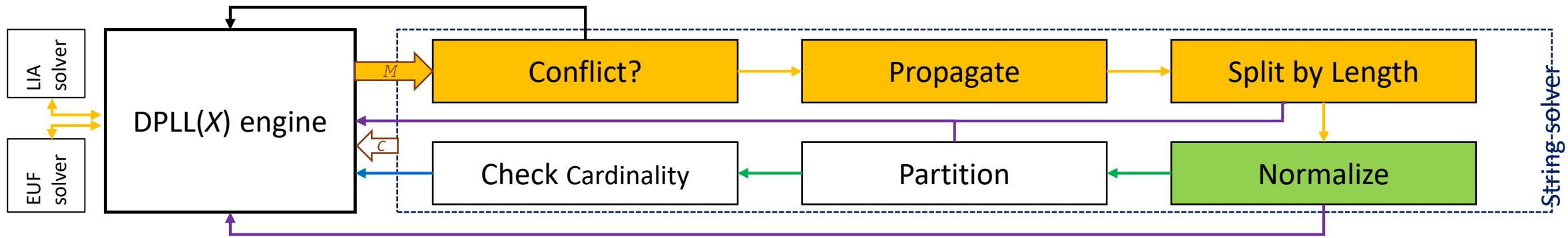
$$\begin{aligned} |x| + |z| &= |y| + |w| + 2 \\ |x| &> |y| \\ |x| &> 0 \\ |y| &> 0 \end{aligned}$$

$$\begin{aligned} |x| &\neq |y| \\ x \cdot z &= y \cdot w \cdot "ab" \end{aligned}$$

Arithmetic Solver

String Solver

Normalization



$$\begin{aligned} |x| &\neq |y| \\ x \cdot z &= y \cdot w \cdot "ab" \end{aligned}$$

String
Solver

Normalize Equalities

$S \quad \{ \quad \boxed{x \cdot z = y \cdot w \cdot "ab"} \}$

To handle string equalities with prefix **x** and **y**
must consider 3 cases...



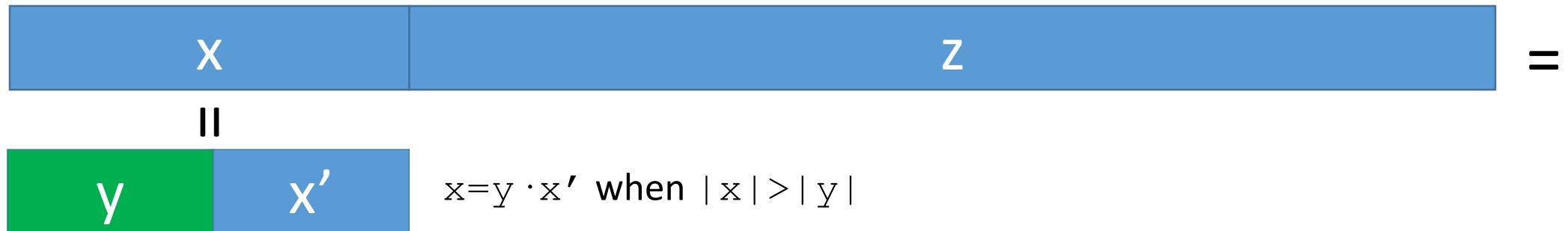
Normalize Equalities

S {

$$\begin{aligned}x \cdot z &= y \cdot w \cdot "ab" \\x &= y \cdot x'\end{aligned}$$

L {

$$|x| > |y|$$



Normalize Equalities

S {

$$\begin{aligned}x \cdot z &= y \cdot w \cdot "ab" \\y &= x \cdot y'\end{aligned}$$

L {

$$|x| < |y|$$

X

Z =

X y'

$$y = x \cdot y' \text{ when } |x| < |y|$$

||

y w "ab"

Normalize Equalities

S {

$$x \cdot z = y \cdot w \cdot "ab"$$
$$x = y$$

L {

$$|x| = |y|$$



|| $x = y$ when $|x| = |y|$



Normalize Equalities

S {

$$x \cdot z = y \cdot w \cdot "ab"$$

L {

$$\begin{aligned} |x| &= |y| \\ |z| &> |w| \end{aligned}$$



Normalize Equalities

S

$$x \cdot z = y \cdot w \cdot "ab"$$
$$\underline{x=y}$$

L

$$|x|=|y|$$
$$|z|>|w|$$



II Since $|x|=|y|$



Normalize Equalities

$$\left. \begin{array}{l} x \cdot z = y \cdot w \cdot "ab" \\ x = y \\ z = w \cdot z' \end{array} \right\} S$$

$$\left. \begin{array}{l} |x| = |y| \\ |z| > |w| \end{array} \right\} L$$



||



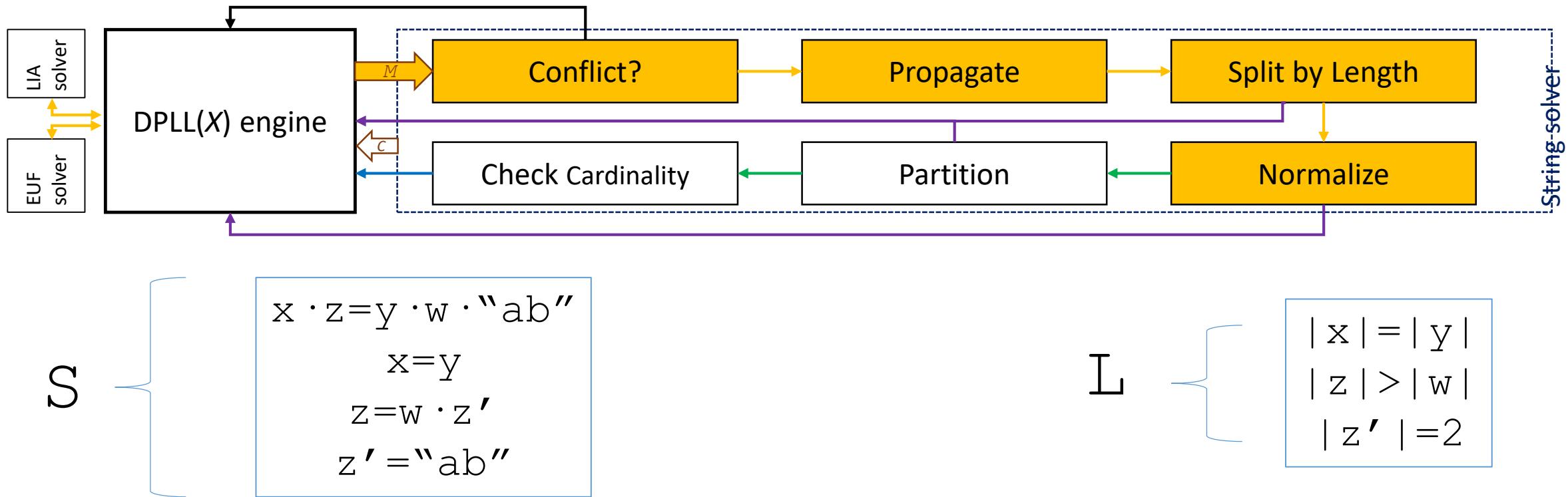
Normalize Equalities

$$S \quad \left\{ \begin{array}{l} x \cdot z = y \cdot w \cdot "ab" \\ x = y \\ z = w \cdot z' \\ z' = "ab" \end{array} \right.$$

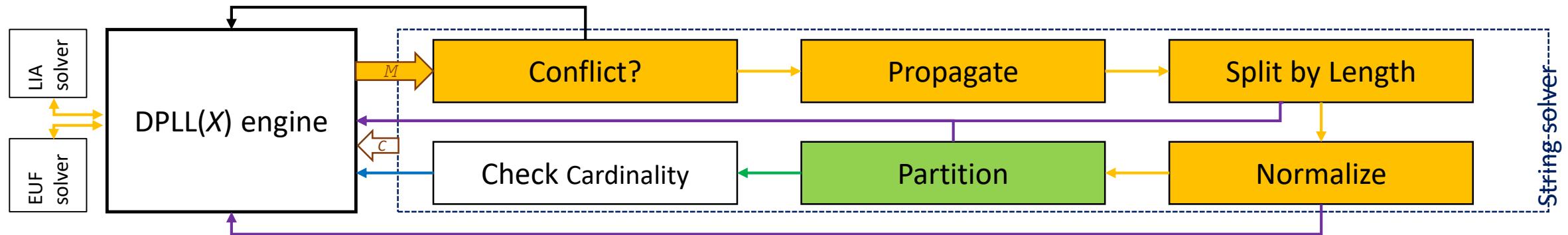
$$L \quad \left. \right\}$$



Normalization



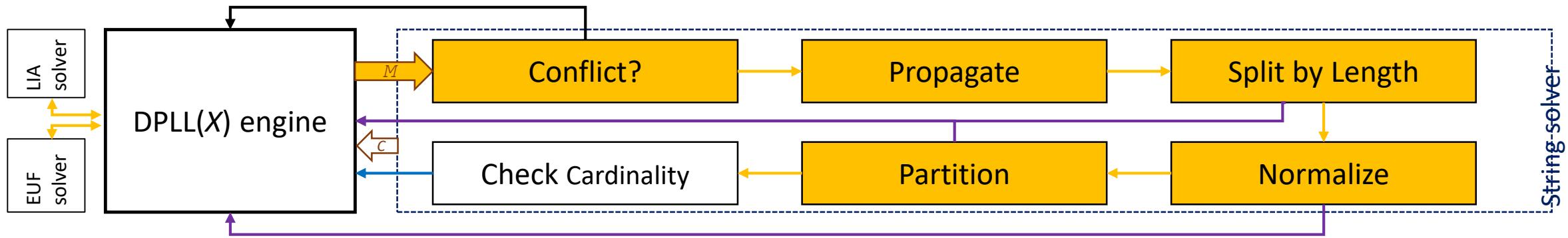
Partition



For strings $x, z, z', "ab"$ $|x| = |z|, |x| \neq |z'| \neq |"ab"| \neq |x|$



Check Cardinality of Σ



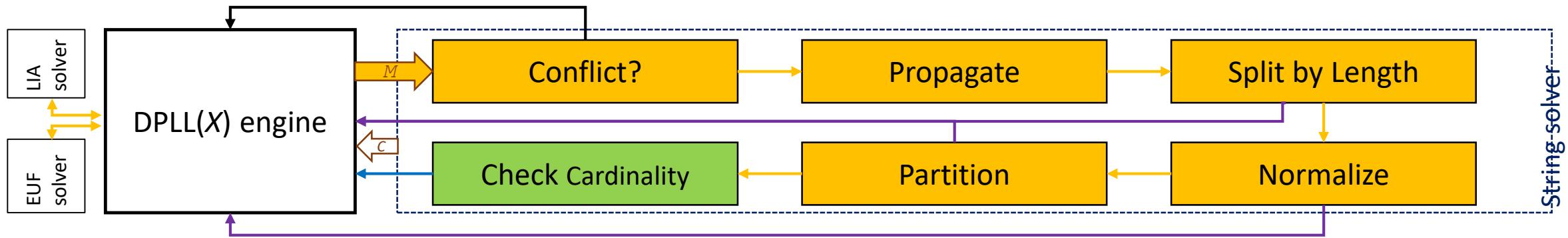
What if, for strings $s_1, s_2, \dots, s_{256}, s_{257}$:

S { $s_i \neq s_j$ for each i, j such that $1 \leq i < j \leq 257$ }

L { $|s_1| = |s_2| = \dots = |s_{256}| = |s_{257}|$ }

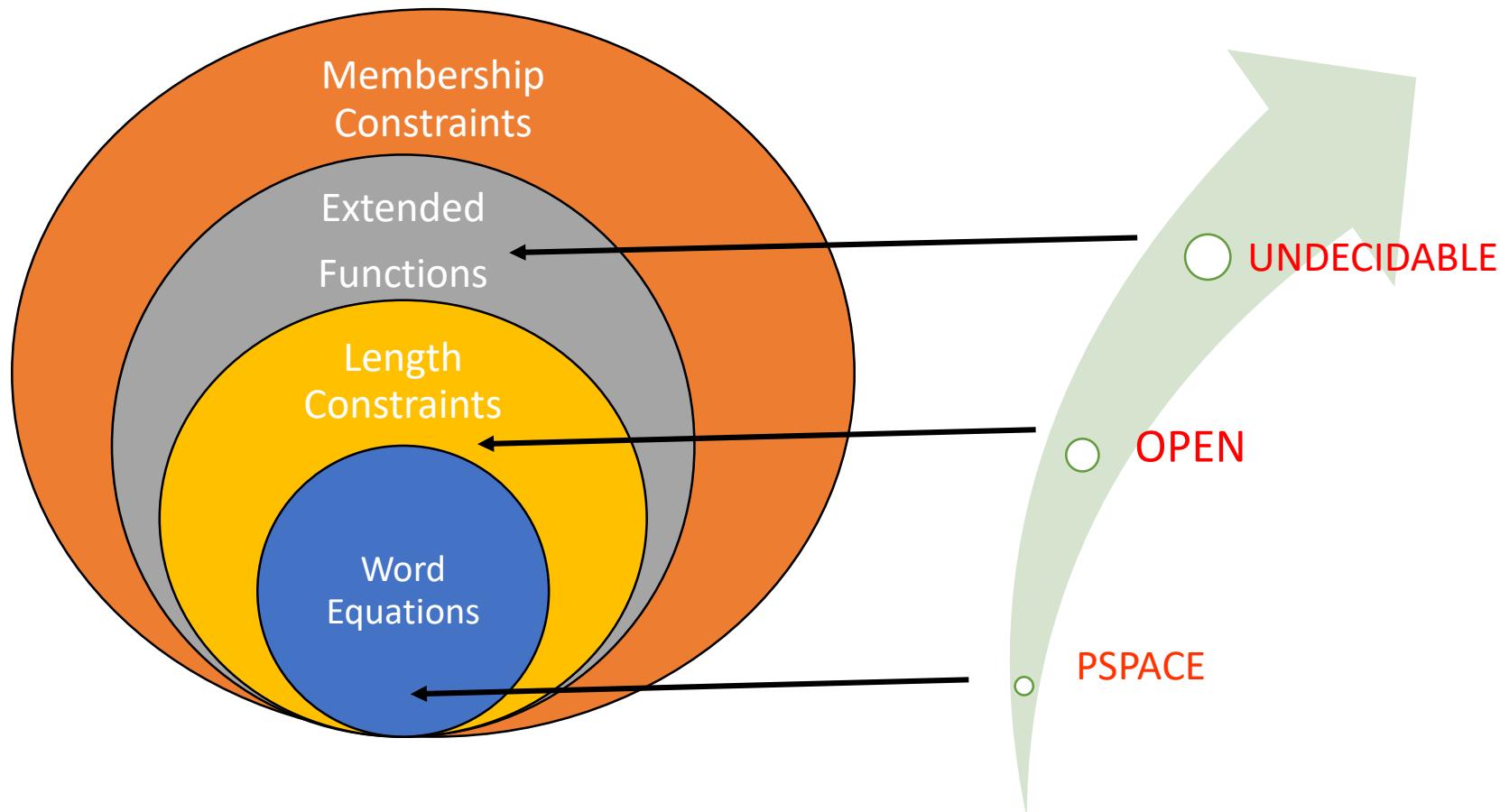


Check Cardinality of Σ



- May be unsatisfiable since Σ is **finite**
 - For instance, if:
 - Σ is a finite alphabet of 256 characters, and
 - $S \cup L$ entails that 257 distinct strings of length 1 exist
- ⇒ Then $S \cup L$ is unsatisfiable
- ∴ **(distinct(s_1, \dots, s_{257}) \wedge $|s_1| = \dots = |s_{257}|$) $\Rightarrow |s_1| > 1$**

Theoretical Complexity Challenges



Extended String Constraints

- Equalities and disequalities between:

- *Basic string terms:*

- String constants
 - String concatenation
 - String length

Examples

“abc”

x.“abc”

|x|

x+4, y>2

- *Linear arithmetic terms*

- *Extended string terms:*

- Substring
 - String Contains
 - String find “index of”
 - String Replace

substr(“abcde”, 1, 3) = “bcd”

contains(“abcde”, “cd”) = T

indexof(“abcde”, “d”, 0) = 3

replace(“ab”, “b”, “c”) = “ac”

Example: $\neg \text{contains}(\text{substr}(x, 0, 3), "a") \wedge 0 \leq \text{indexof}(x, "ab", 0) < 4$

How do we handle Extended String Constraints?

$\neg \text{contains}(x, "a")$

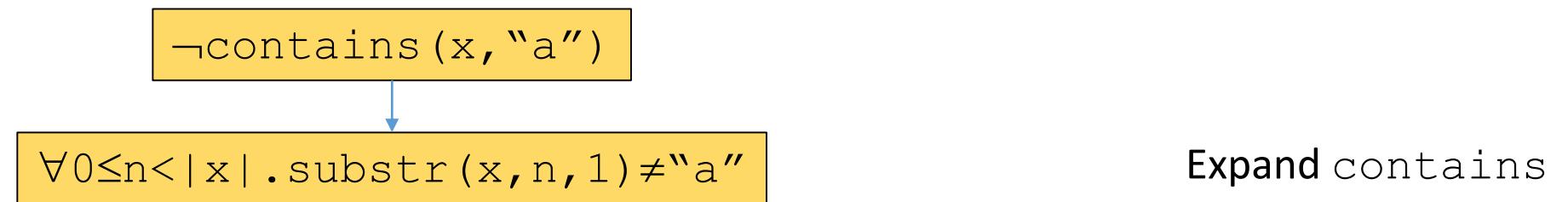
How do we handle Extended String Constraints?

- Naively, by **reduction** to basic constraints + bounded \forall

$\neg\text{contains}(x, "a")$

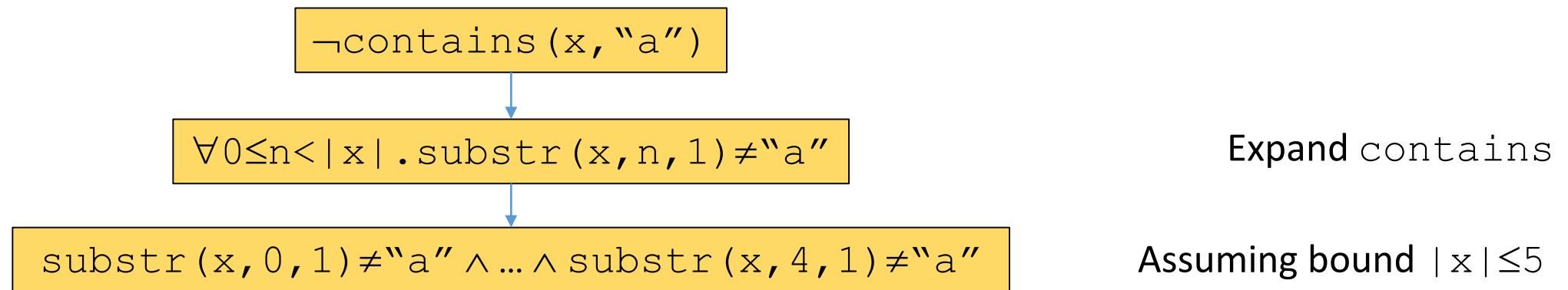
How do we handle Extended String Constraints?

- Naively, by **reduction** to basic constraints + bounded \forall



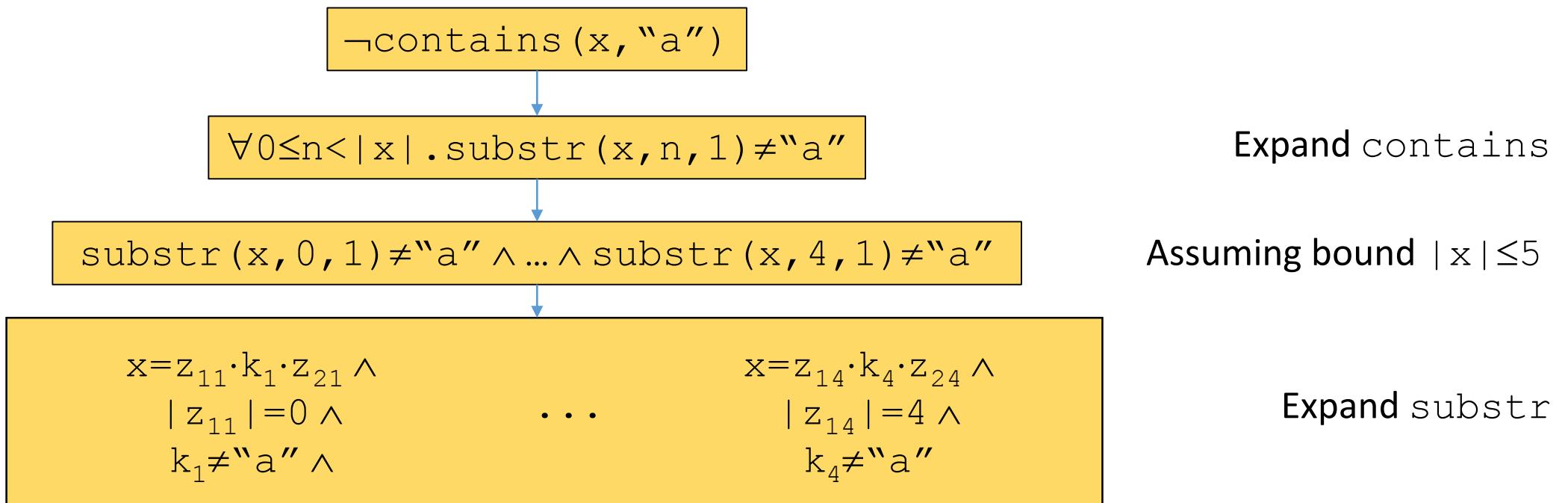
How do we handle Extended String Constraints?

- Naively, by **reduction** to basic constraints + bounded \forall



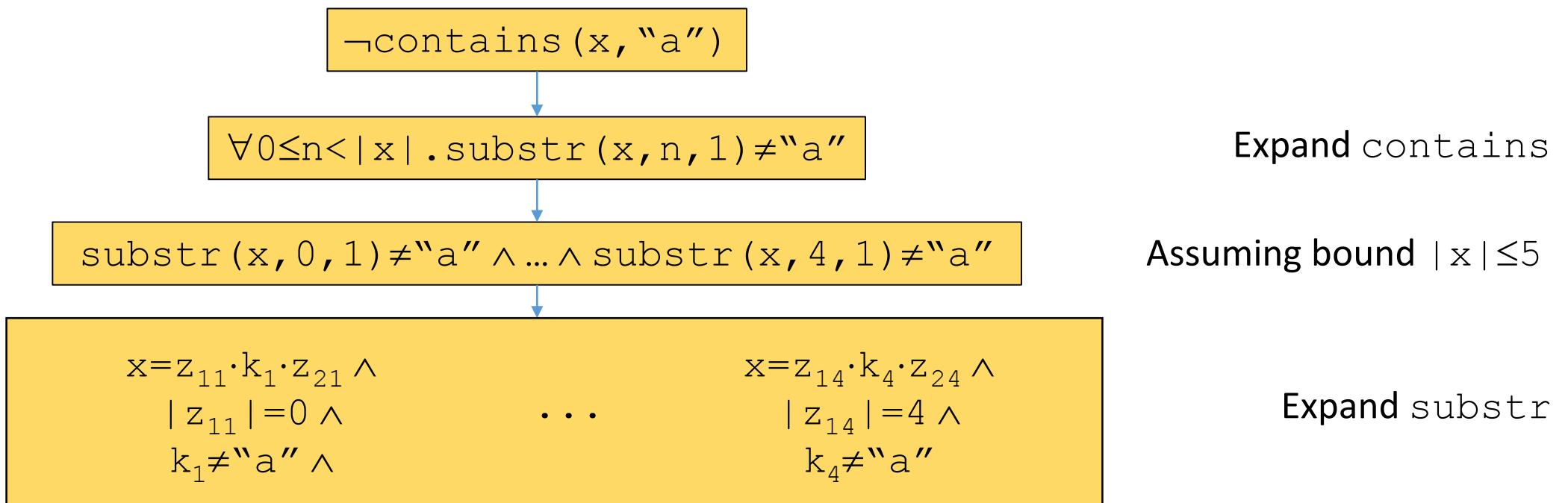
How do we handle Extended String Constraints?

- Naively, by **reduction** to basic constraints + bounded \forall



How do we handle Extended String Constraints?

- Naively, by **reduction** to basic constraints + bounded \forall



- Approach used by many current solvers
[Bjorner et al 2009, Zheng et al 2013, Li et al 2013, Trinh et al 2014]

(Eager) Expansion of Extended Constraints

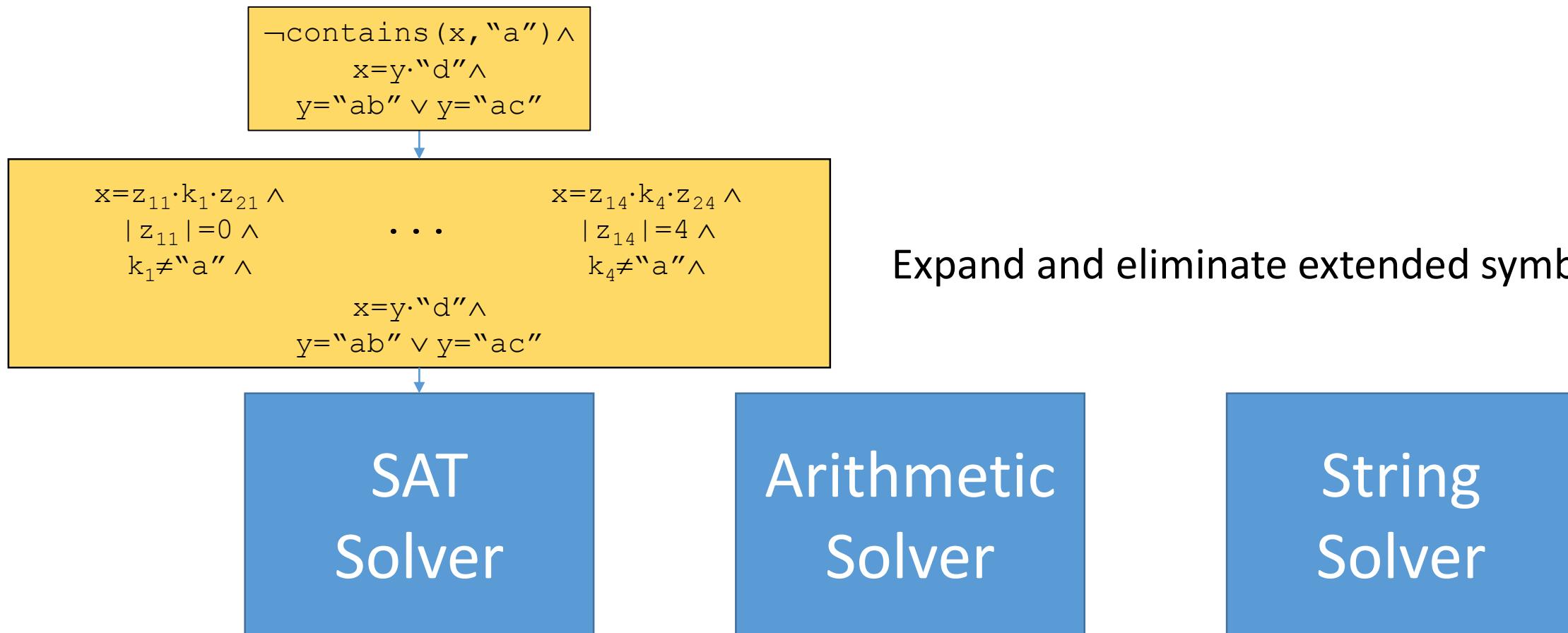
```
¬contains(x, "a") ∧  
  x=y · "d" ∧  
  y="ab" ∨ y="ac"
```

SAT
Solver

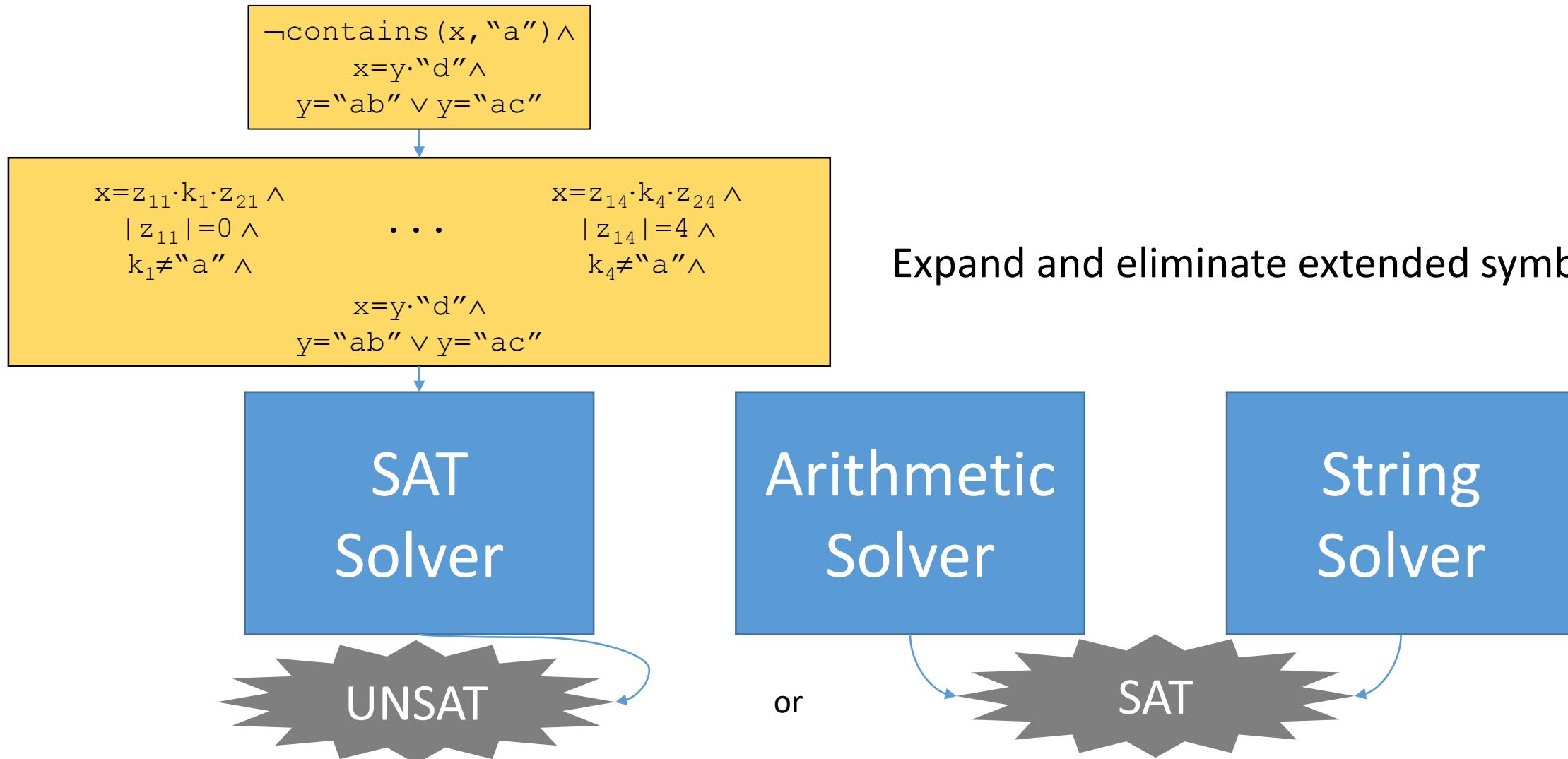
Arithmetic
Solver

String
Solver

(Eager) Expansion of Extended Constraints



(Eager) Expansion of Extended Constraints



(Lazy) Expansion of Extended Constraints

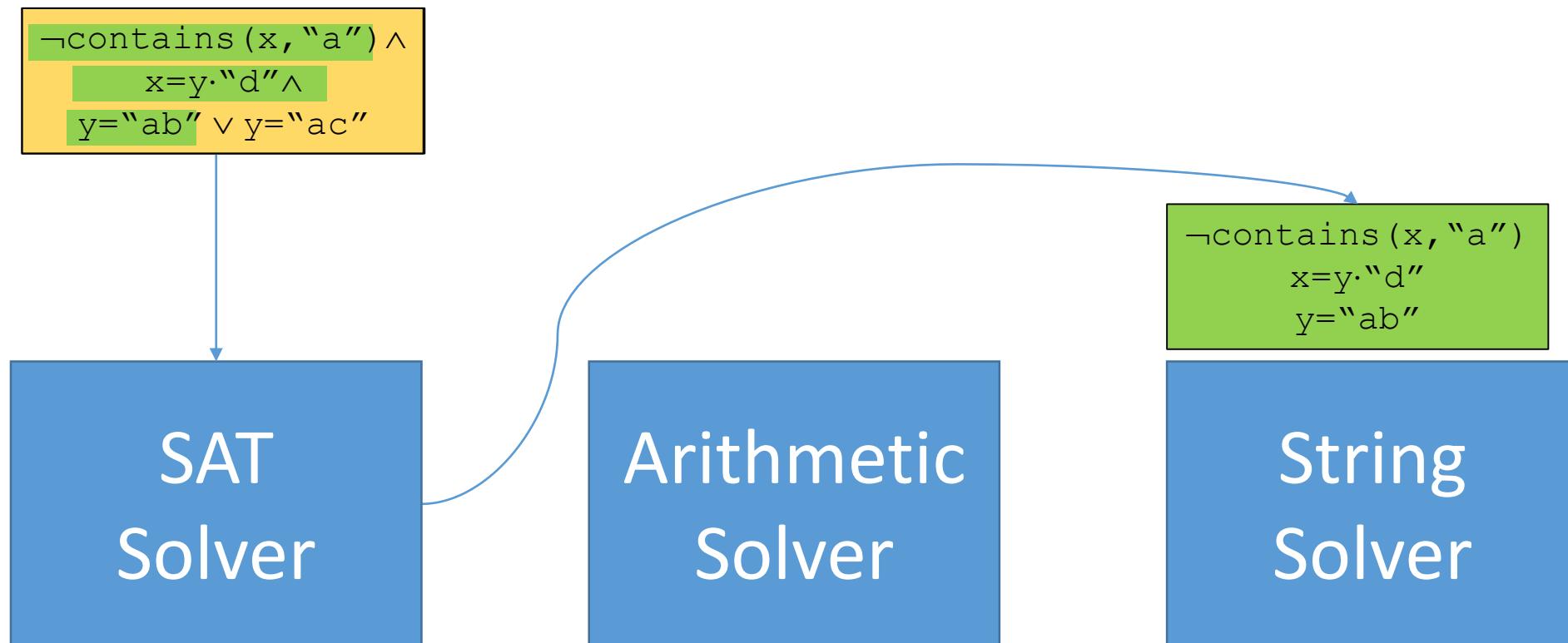
```
¬contains(x, "a") ∧  
  x=y.“d” ∧  
  y=“ab” ∨ y=“ac”
```

SAT
Solver

Arithmetic
Solver

String
Solver

(Lazy) Expansion of Extended Constraints



(Lazy) Expansion of Extended Constraints

```
¬contains(x, "a") ∧  
x=y·"d" ∧  
y="ab" ∨ y="ac"
```



SAT
Solver

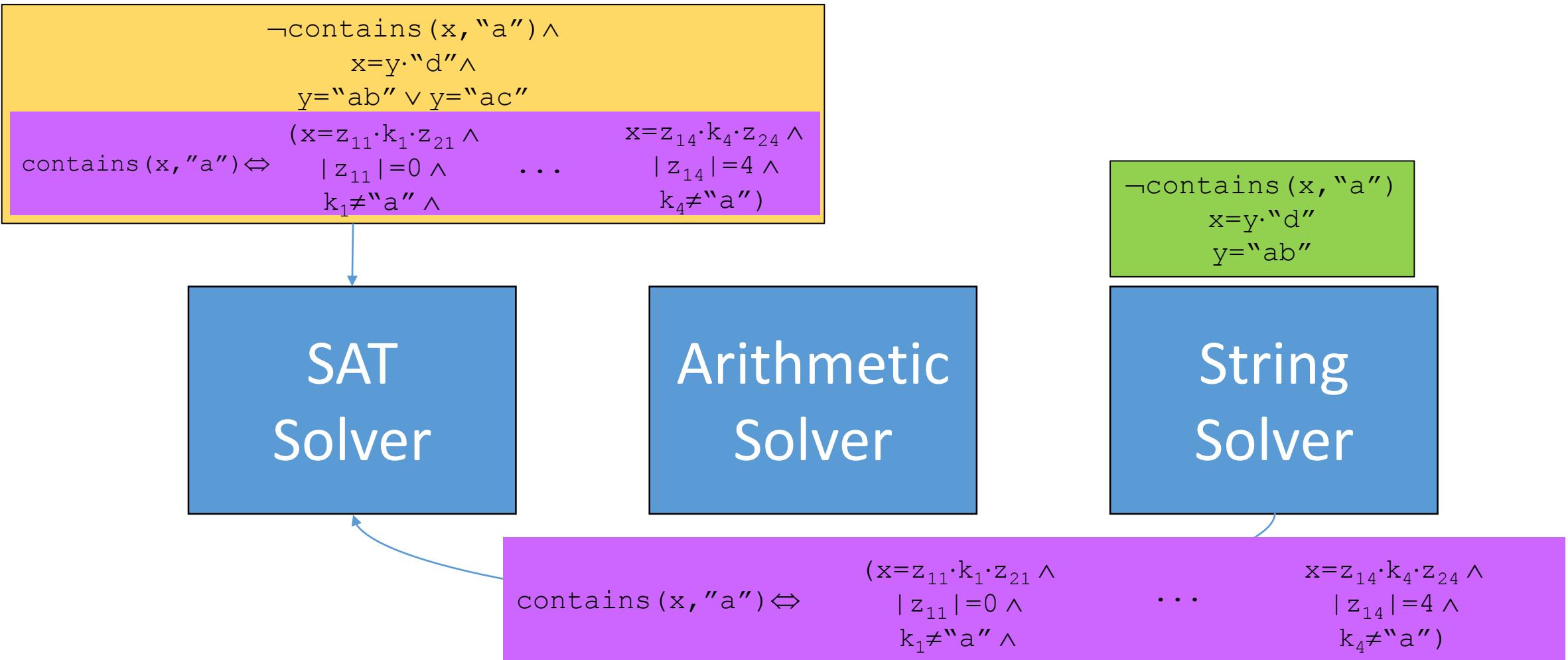
Arithmetic
Solver

```
¬contains(x, "a")  
x=y·"d"  
y="ab"
```

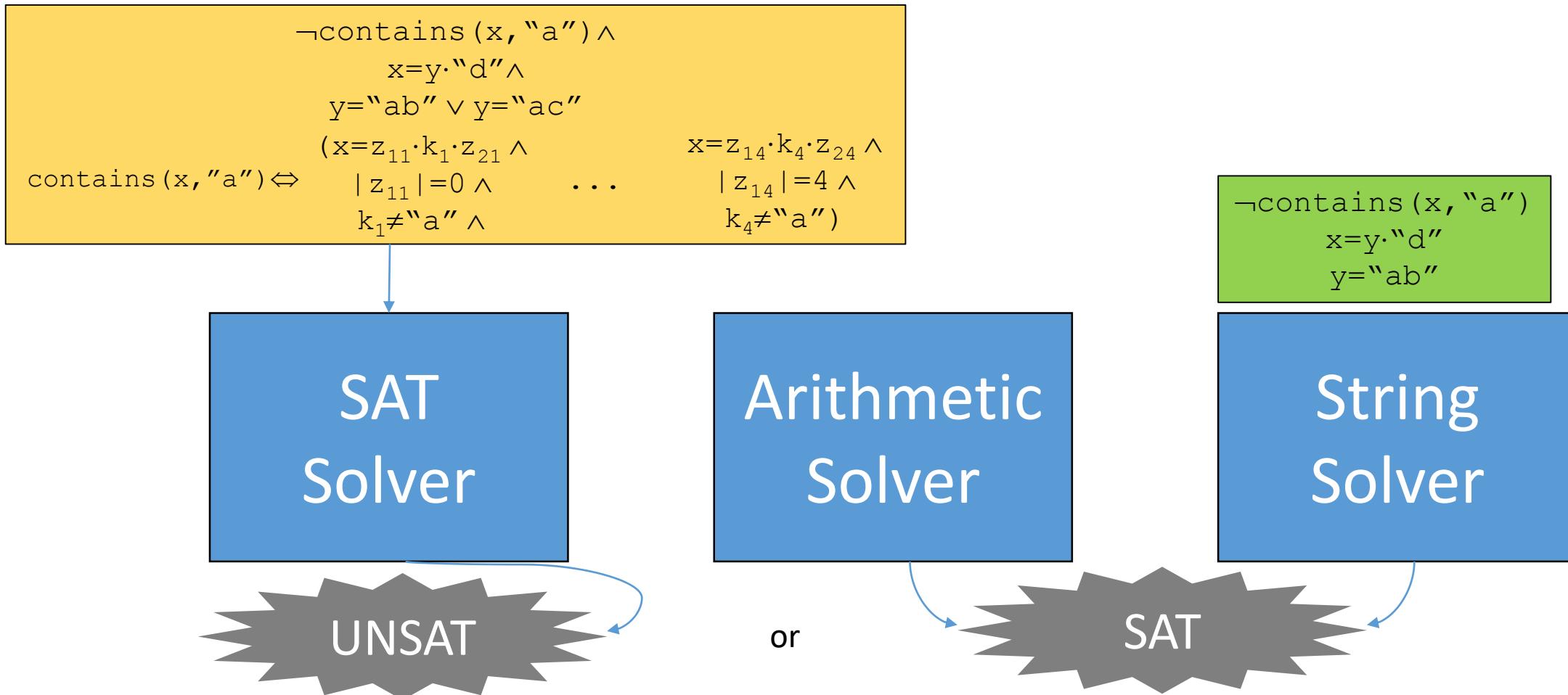
String
Solver

$\text{contains}(x, "a") \Leftrightarrow$ $(x=z_{11} \cdot k_1 \cdot z_{21} \wedge |z_{11}|=0 \wedge k_1 \neq "a") \vee \dots \vee (x=z_{14} \cdot k_4 \cdot z_{24} \wedge |z_{14}|=4 \wedge k_4 \neq "a")$

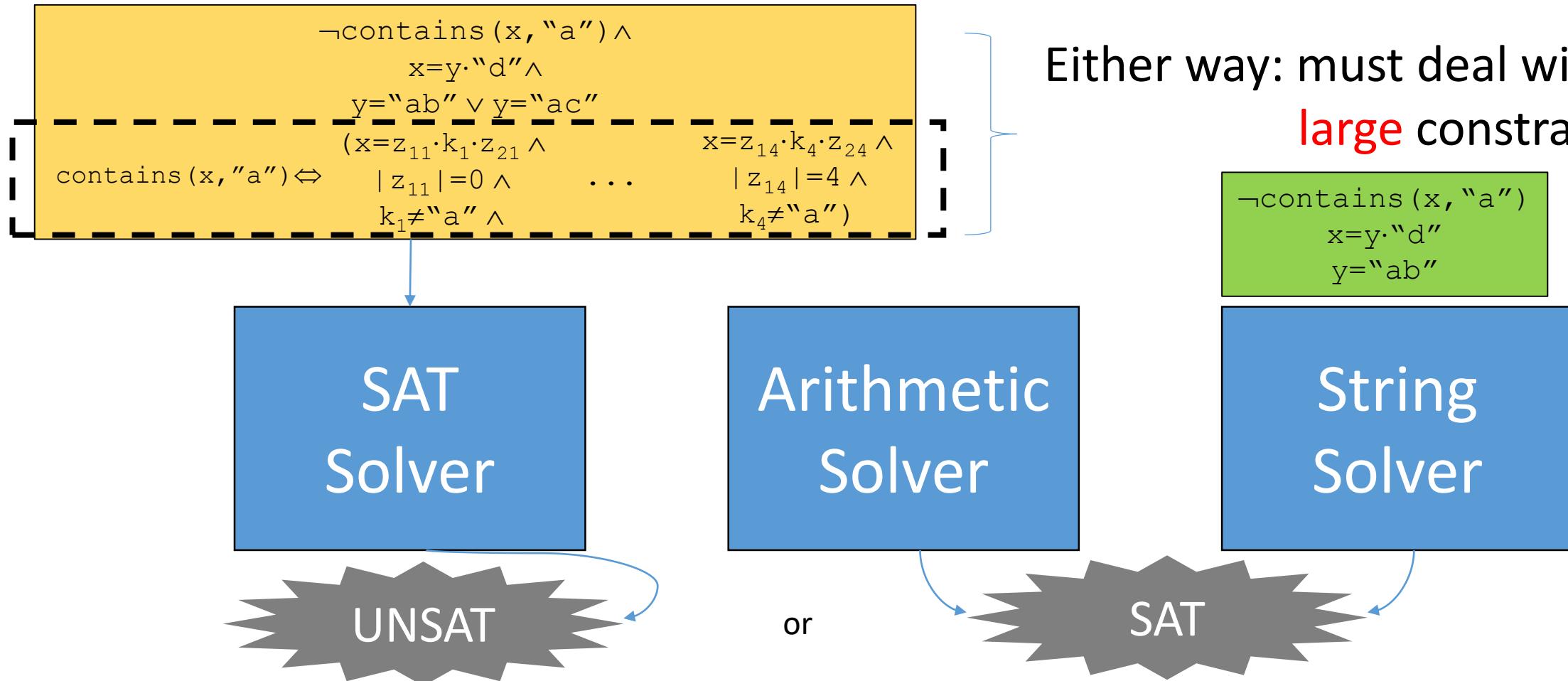
(Lazy) Expansion of Extended Constraints



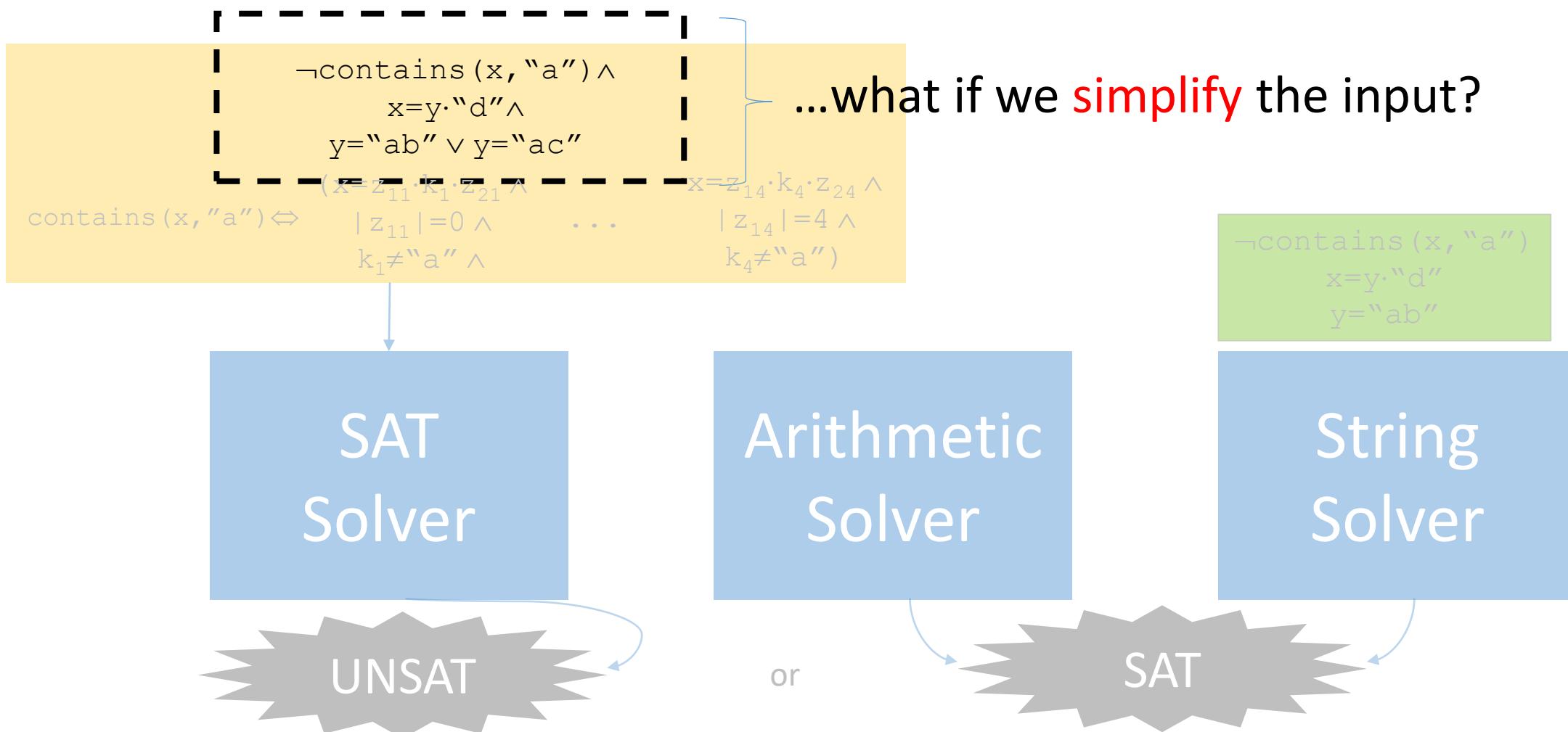
(Lazy) Expansion of Extended Constraints



(Lazy) Expansion of Extended Constraints



(Lazy) Expansion of Extended Constraints



SMT Solvers + Simplification

- All SMT solvers implement *simplification* techniques
(also called *normalization* or *rewrite* rules)

```
¬contains(x, "a") ∧  
    x=y · "d" ∧  
    y="ab" ∨ y="ac"
```

SMT Solvers + Simplification

- All SMT solvers implement *simplification* techniques
(also called *normalization* or *rewrite* rules)

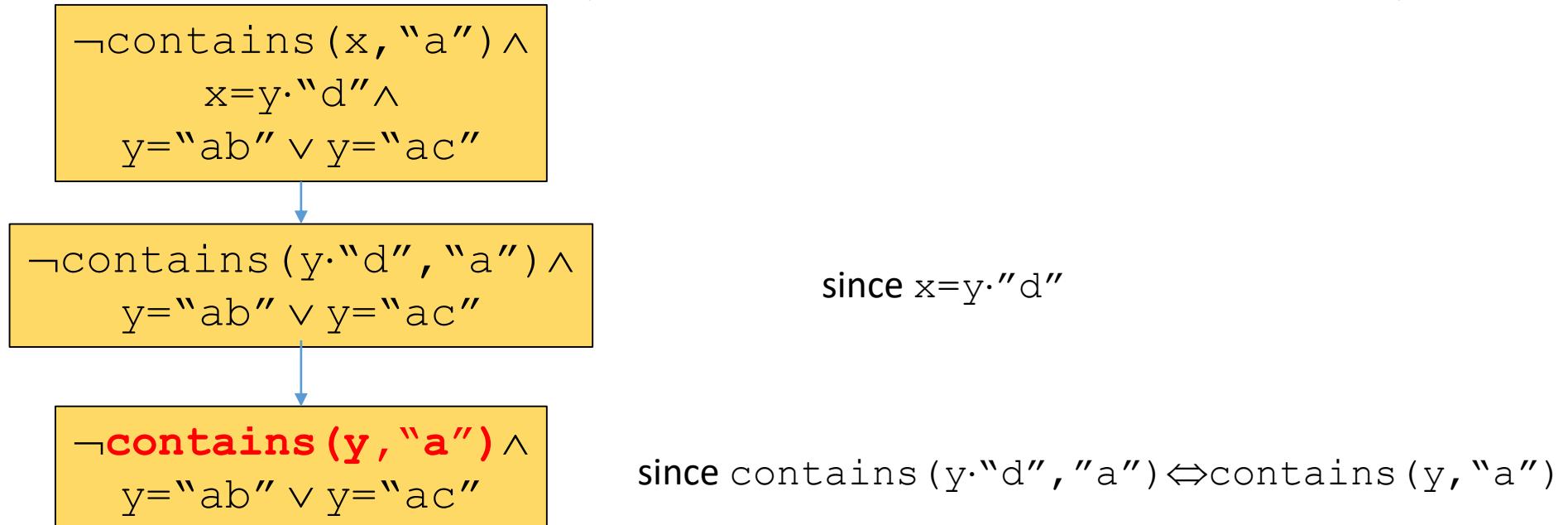
$$\neg \text{contains}(x, "a") \wedge \\ x = y \cdot "d" \wedge \\ y = "ab" \vee y = "ac"$$

$$\neg \text{contains}(\textcolor{red}{y \cdot "d"} , "a") \wedge \\ y = "ab" \vee y = "ac"$$

since $x = y \cdot "d"$

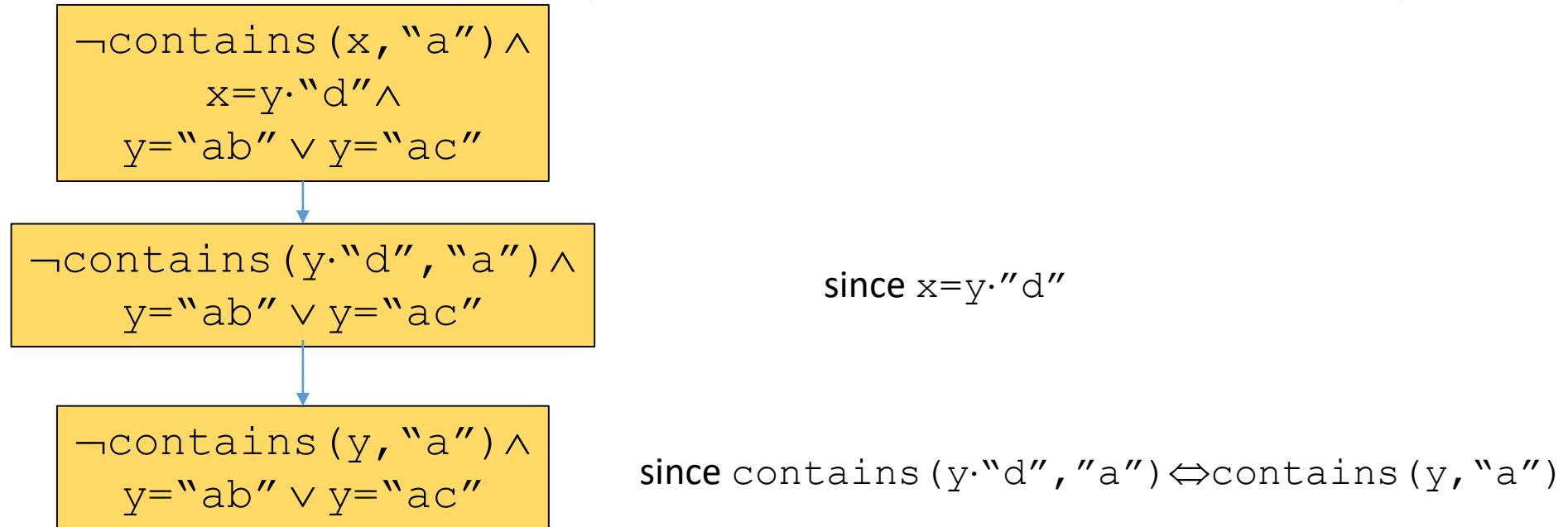
SMT Solvers + Simplification

- All SMT solvers implement *simplification* techniques
(also called *normalization* or *rewrite* rules)



SMT Solvers + Simplification

- All SMT solvers implement *simplification* techniques
(also called *normalization* or *rewrite* rules)



- Leads to smaller inputs, simpler procedures

(Lazy) Expansion + Simplification

```
¬contains(x, "a") ∧  
  x=y·"d" ∧  
  y="ab" ∨ y="ac"
```

SAT
Solver

Arithmetic
Solver

String
Solver

(Lazy) Expansion + Simplification

```
¬contains(x, "a") ∧  
  x=y·"d" ∧  
  y="ab" ∨ y="ac"
```

```
¬contains(y, "a") ∧  
  y="ab" ∨ y="ac"
```

SAT
Solver

Simplify the input

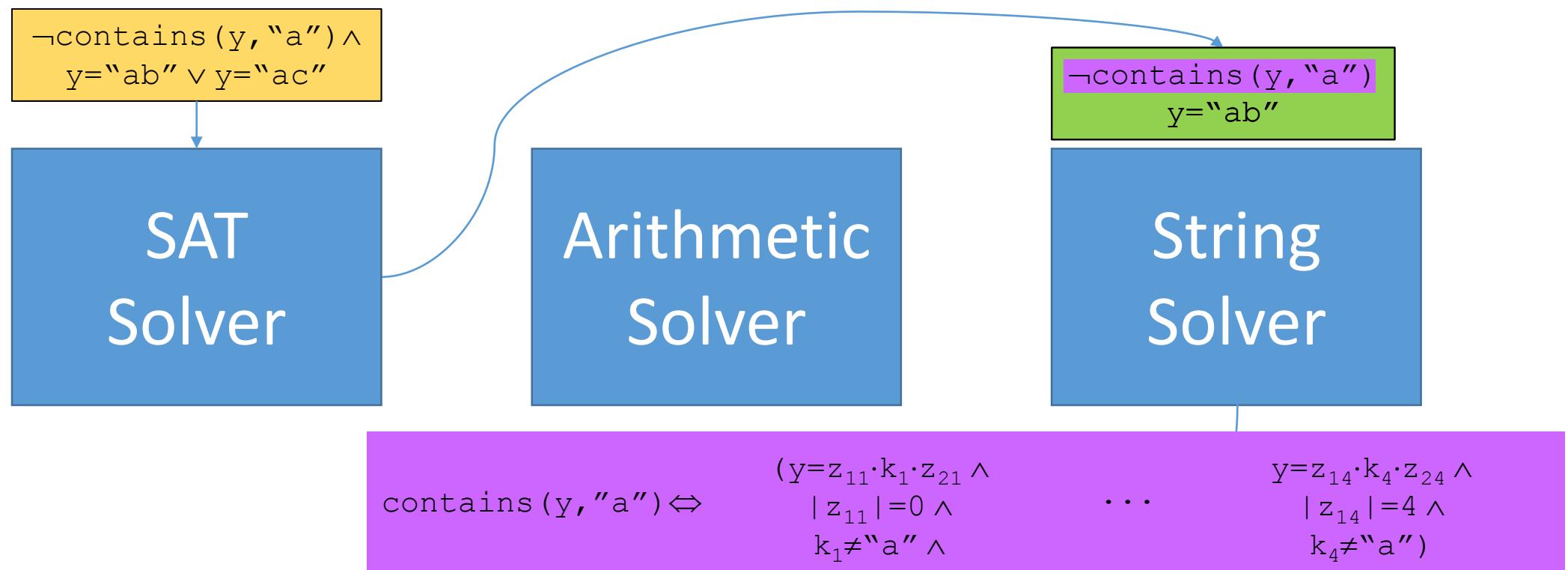
Arithmetic
Solver

String
Solver

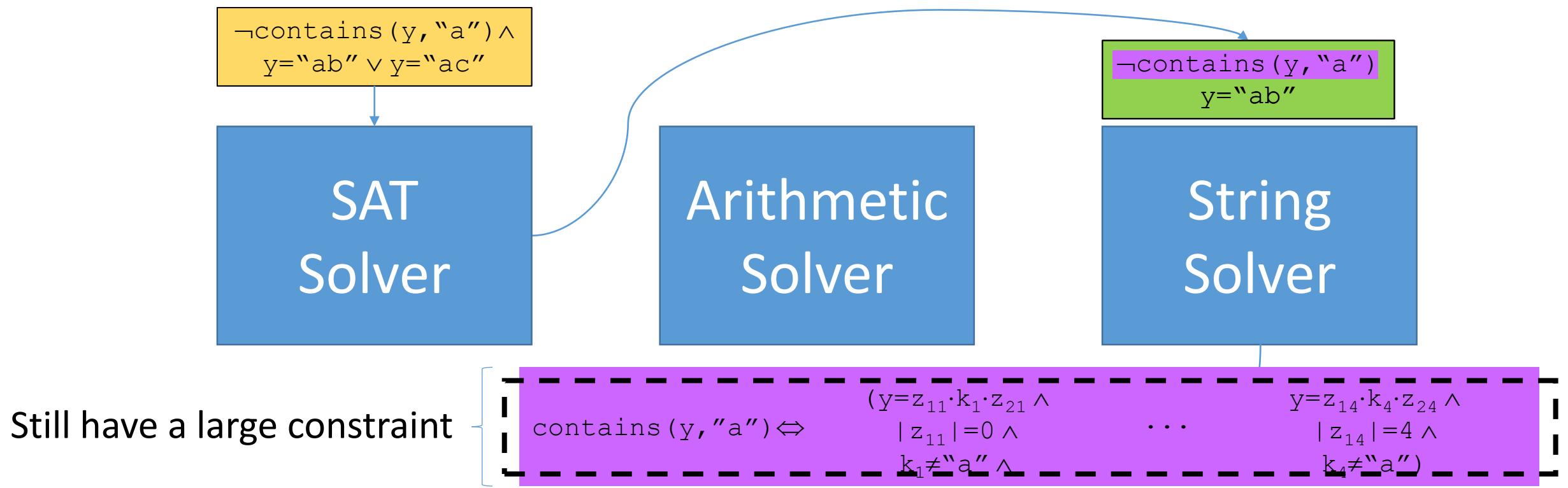
(Lazy) Expansion + Simplification



(Lazy) Expansion + Simplification

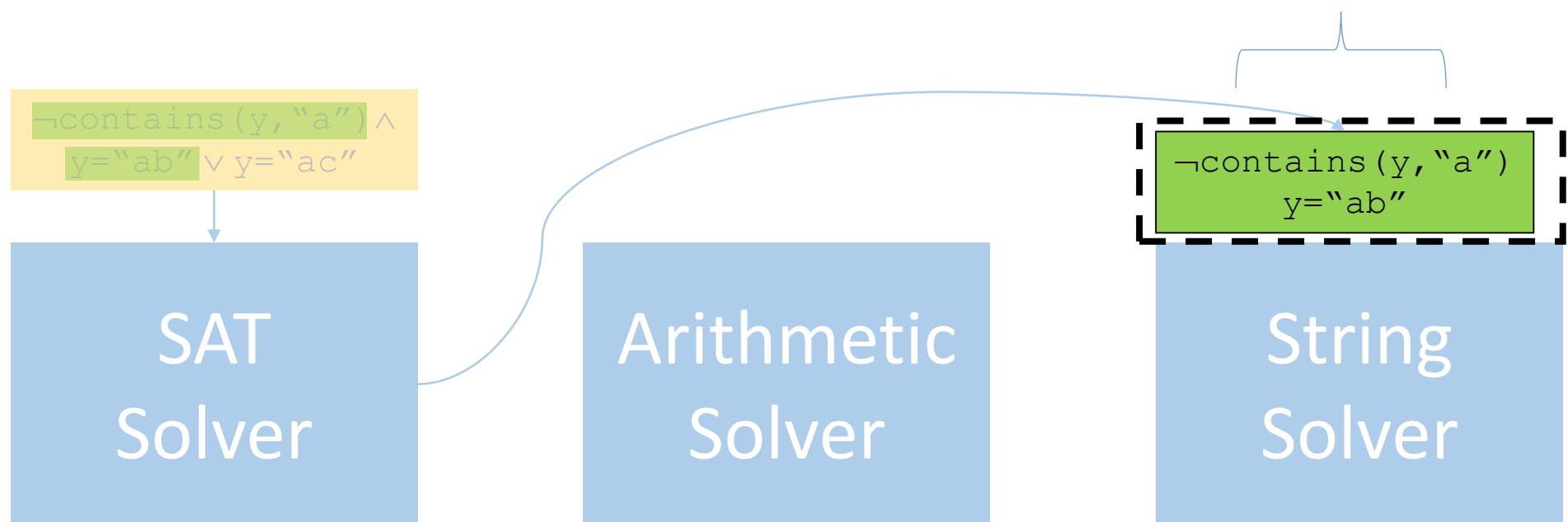


(Lazy) Expansion + Simplification



(Lazy) Expansion + Simplification

What if we simplify based on the context?



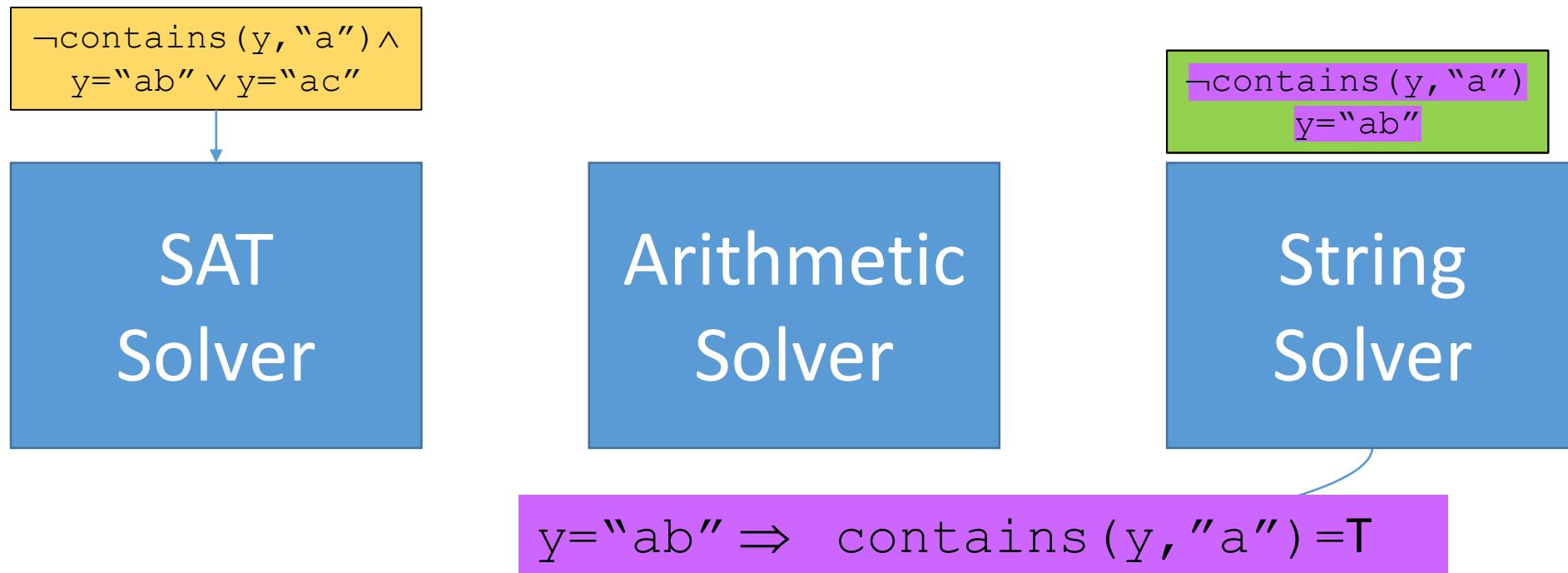
$$\text{contains}(y, "a") \Leftrightarrow (y = z_{11} \cdot k_1 \cdot z_{21} \wedge |z_{11}| = 0 \wedge k_1 \neq "a" \wedge \dots \wedge y = z_{14} \cdot k_4 \cdot z_{24} \wedge |z_{14}| = 4 \wedge k_4 \neq "a")$$

(Lazy) Expansion + **Context-Dependent** Simplification

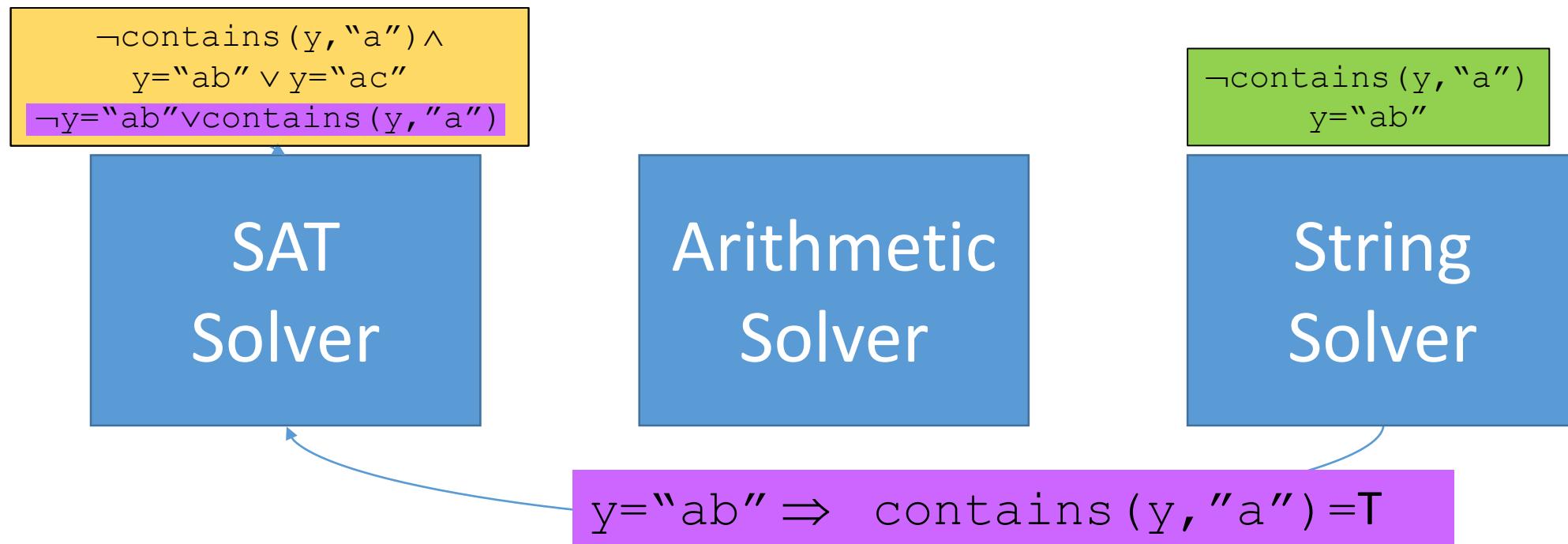


Since $\text{contains}(y, "a")$ is true when $y = "ab"$...

(Lazy) Expansion + **Context-Dependent** Simplification



(Lazy) Expansion + **Context-Dependent** Simplification



(Lazy) Expansion + **Context-Dependent** Simplification

$\neg\text{contains}(y, "a") \wedge$
 $y = "ab" \vee y = "ac"$
 $\neg y = "ab" \vee \text{contains}(y, "a")$

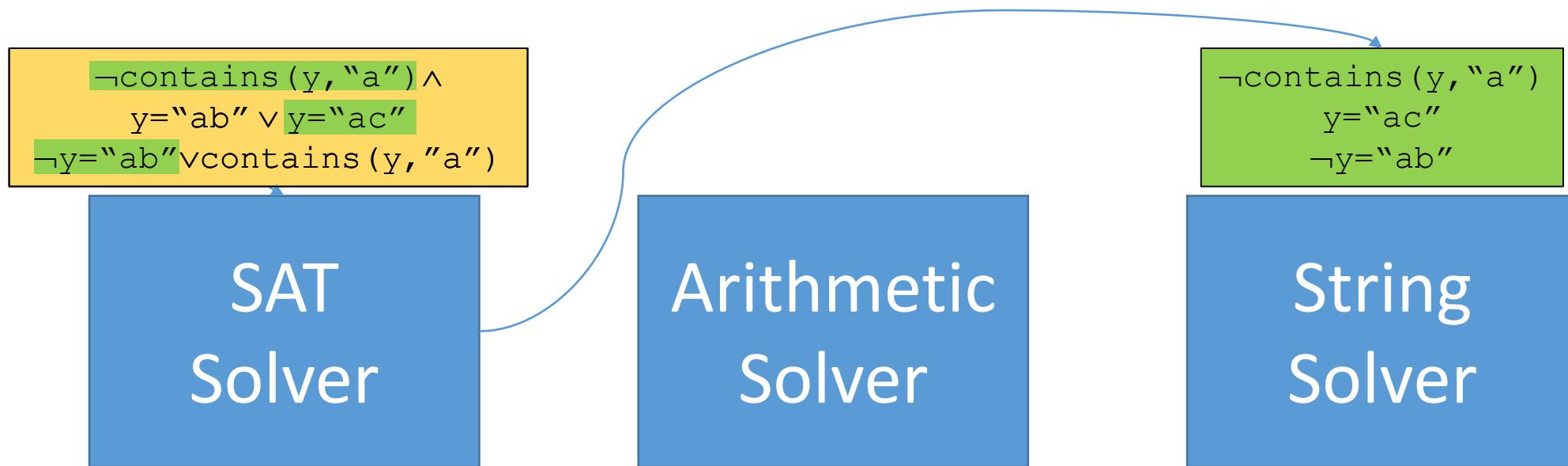
SAT
Solver

$\neg\text{contains}(y, "a")$
 $y = "ab"$

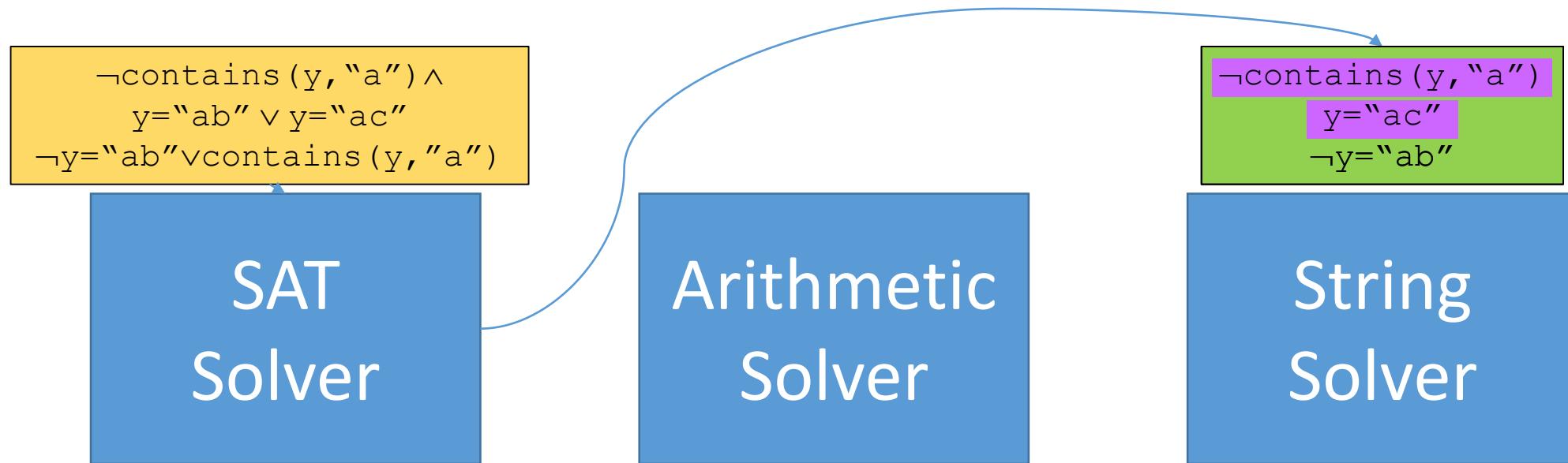
String
Solver

Arithmetic
Solver

(Lazy) Expansion + **Context-Dependent** Simplification

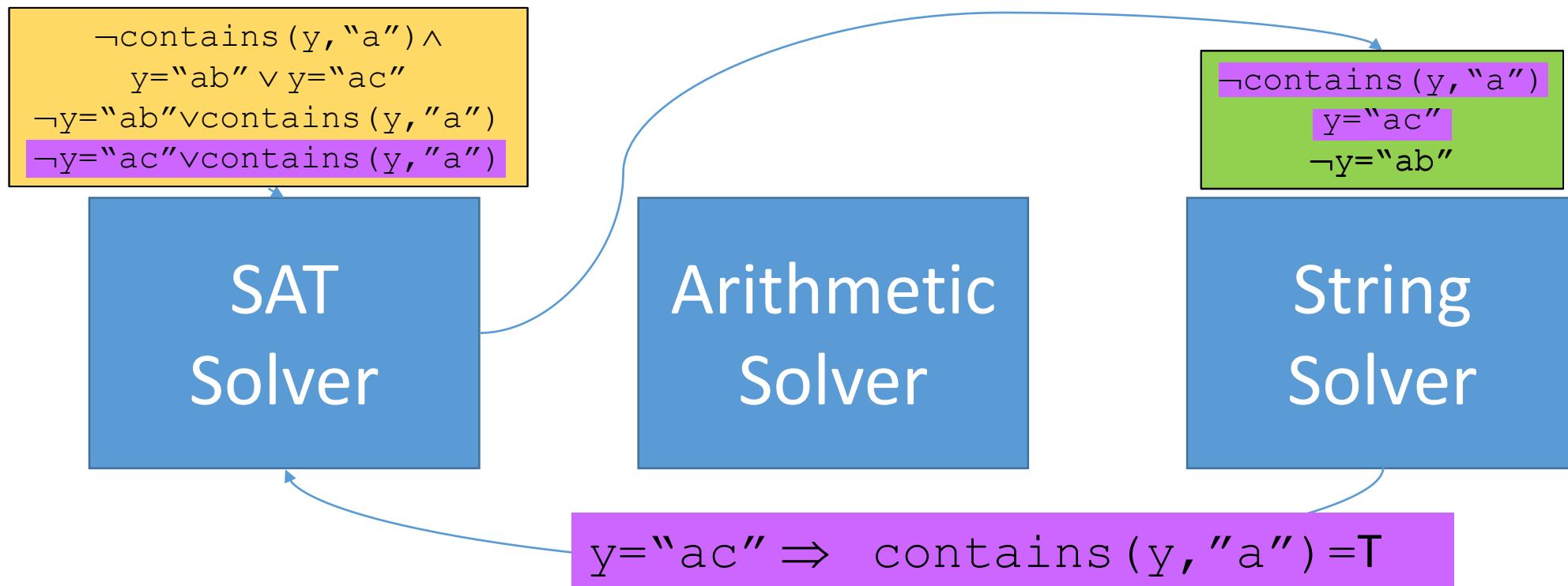


(Lazy) Expansion + **Context-Dependent** Simplification

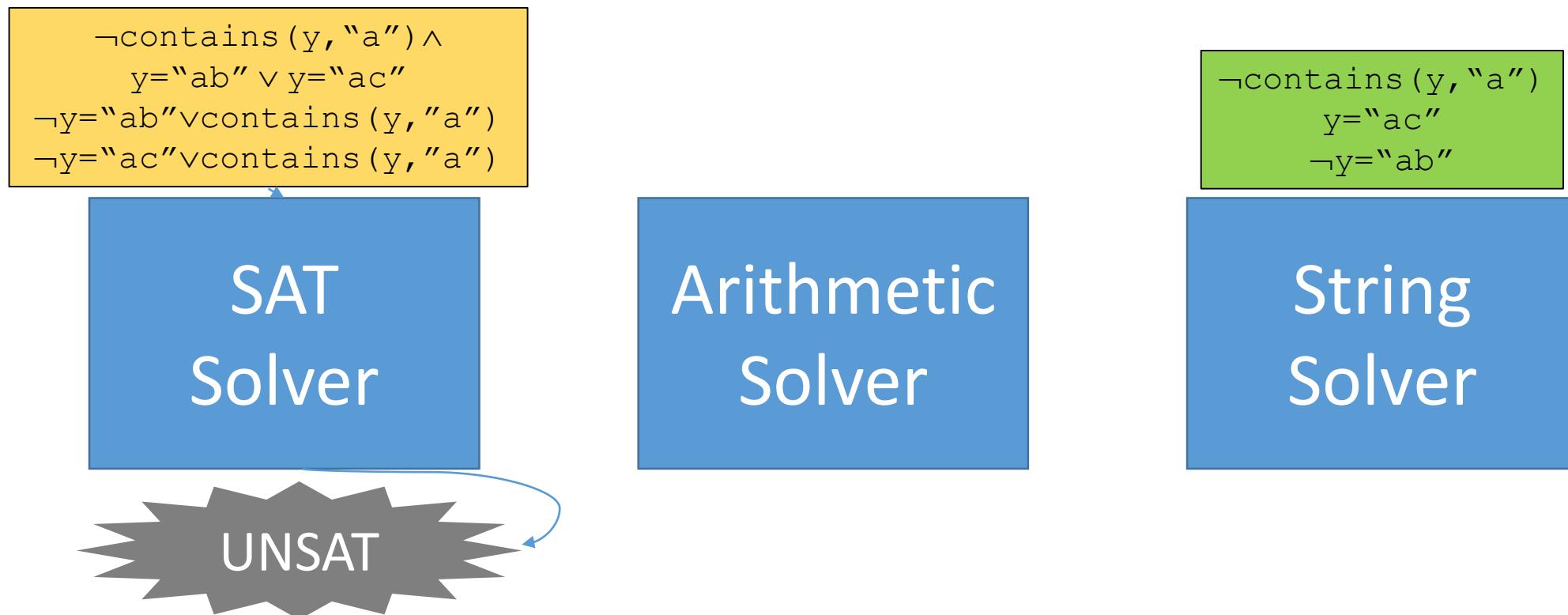


$\text{contains}(y, "a")$ is also true when $y = "ac"$...

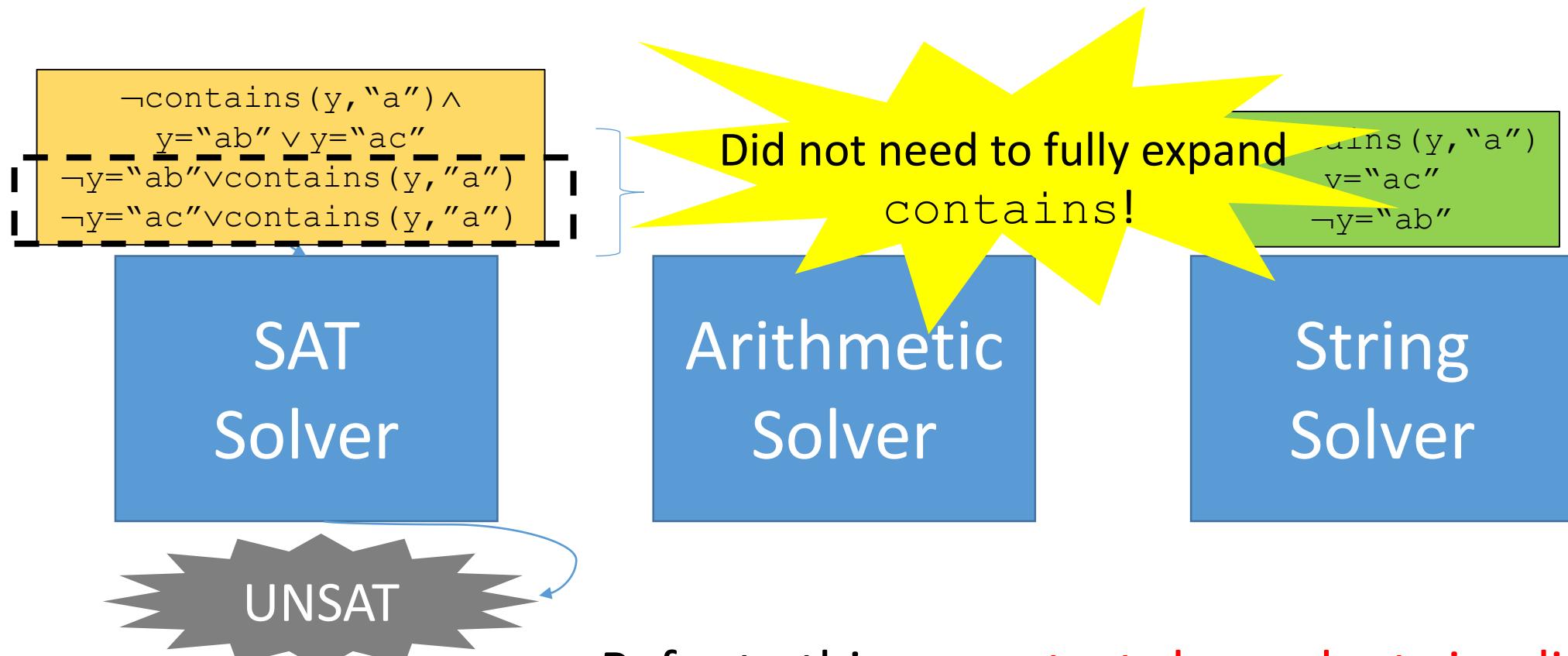
(Lazy) Expansion + **Context-Dependent** Simplification



(Lazy) Expansion + **Context-Dependent** Simplification



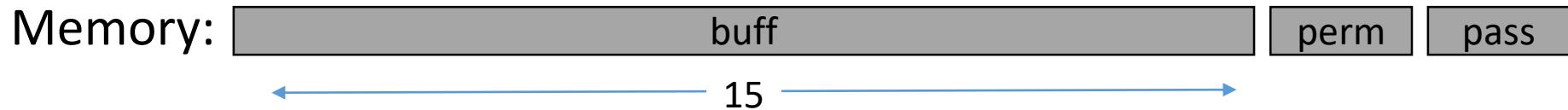
(Lazy) Expansion + **Context-Dependent** Simplification



Examples

Symbolic Execution

```
char buff[15];
char permission = 'N';
char pass = 'N';
cout << "Enter the password :";
gets(input);
0  if(strcmp(buff, "PASSWORD")) {
    cout << "Correct Password";
    permission= 'Y';
    pass = 'Y';
} else {
    cout << "Wrong Password";
    pass= 'N';
}
1
2  if(permission == 'Y') { //grant root access
    Assert(pass='Y' );
}
```



EXAMPLE A5...

Symbolic Execution

```
char buff[15];
char permission = 'N';
char pass = 'N';
cout << "Enter the password :";
gets(input);
if(strcmp(buff, "PASSWORD")) {
    cout << "Correct Password";
    permission= 'Y';
    pass = 'Y';
} else {
    cout << "Wrong Password";
    pass= 'N';
}
if(permission == 'Y') { //grant root access
    Assert(pass='Y' );
}
```

Symbolic Execution

```
char buff[15];
char permission = 'N';
char pass = 'N';
cout << "Enter the password :";
gets(input);
if(strcmp(buff, "PASSWORD")) {
    cout << "Correct Password";
    permission= 'Y';
    pass = 'Y';
} else {
    cout << "Wrong Password";
    pass= 'N';
}
if(permission == 'Y') { //grant root access
    Assert(pass='Y' );
}
```

Symbolic Execution

```
char buff[15];
char permission = 'N';
char pass = 'N';
cout << "Enter the password :";
gets(input);
if(strcmp(buff, "PASSWORD")) {
    cout << "Correct Password";
    permission= 'Y';
    pass = 'Y';
} else {
    cout << "Wrong Password";
    pass= 'N';
}
if(permission == 'Y') { //grant root access
    Assert(pass='Y' );
}
```

EXAMPLE A5-inc...

Symbolic Execution

```
char buff[15];
char permission = 'N';
char pass = 'N';
cout << "Enter the password :";
gets(input); ← "AAAAAAAAAAAAAAAY"
if(strcmp(buff, "PASSWORD")) {
    cout << "Correct Password";
    permission= 'Y';
    pass = 'Y';
} else {
    cout << "Wrong Password";
    pass= 'N';
}
if(permission == 'Y') { //grant root access
    Assert(pass=='Y'); ← pass=="N"
}
```

Symbolic Execution #2

```
cout << "Enter text to print :";
string input;
gets(input);
string data= 'p' ++ input ++ ';'xcvc4';
int index=0;
while(index<str.len(data)){
    int end=indexof(data, ',',index+1);
    string cmd=substr(data,index+1,end-(index+1));
    if(cmd!=""){
        if(substr(data,index,1)=='p'){
            cout << curr_cmd << endl;
        }else if(substr(data,index,1)=='x'){
            exec(cmd);
            Assert(cmd=="cvc4");
        }else{
            cout << "Bad command" << endl;
        }
    }
    index=end+1;
}
```

EXAMPLE A6...

Symbolic Execution #2

```
cout << "Enter text to print :";
string input;
gets(input);
string data= 'p' ++ input ++ 'xcvc4';
int index=0;
while(index<str.len(data)){
    int end=indexof(data,':',index+1);
    string cmd=substr(data,index+1,end-(index+1));
    if(cmd!=""){
        if(substr(data,index,1)=='p'){
            cout << curr_cmd << endl;
        }else if(substr(data,index,1)=='x'){
            exec(cmd);
            Assert(cmd=="cvc4");
        }else{
            cout << "Bad command" << endl;
        }
    }
    index=end+1;
}
```

Expects data to be a string like:
p[TEXT1];x[PROG1];x[PROG2];p[TEXT2];...
where

- pTEXT; prints “TEXT”
- xPROG; runs program “PROG”

Symbolic Execution #2

```
cout << "Enter text to print :";
string input;
gets(input); ← “;xATTACK”
string data=‘p’ ++ input ++ ‘;xcvc4;’;
int index=0;
while(index<str.len(data)){
    int end=indexof(data,’;’,index+1);
    string cmd=substr(data,index+1,end-(index+1));
    if(cmd!=“”){
        if(substr(data,index,1)=‘p’){
            cout << curr_cmd << endl;
        }else if(substr(data,index,1)=‘x’){
            exec(cmd); ← exec(“ATTACK”)
            Assert(cmd==“cvc4”);
        }else{
            cout << “Bad command” << endl;
        }
    }
    index=end+1;
}
```

Symbolic Execution #3

```
cout << "Enter text to print :";
string input;
char setup='N';
gets(input);
string data= 'p' ++ input ++ ';xi;xroot';
int index=0;
while(0≤index<str.len(data)){
    int end=indexof(data, ',',index+1);
    string cmd=substr(data,index+1,end-(index+1));
    runCmd( cmd, setup, index );
    index=end+1;
}
```

start index

↓
'p' ++ input ++ ';xsetup;xroot';

```
void runCmd( string cmd, char& setup, int& index ){
    if(substr(data,index,1)='p'){
        cout << curr_cmd << endl;
    }else if(substr(data,index,1)='g'){
        index := str.to.int(index);
    }else if(substr(data,index,1)='x'){
        exec(cmd);
        if(cmd==“setup”){
            setup='Y';
        }else if(cmd==“root”){
            Assert(setup='Y');
        }
    }
}
```

- pTEXT; prints “TEXT”
- xPROG; runs program “PROG”
 - xsetup; sets setup='Y'
- gN; goes to index N

EXAMPLE A7...

Symbolic Execution #3

```
cout << "Enter text to print ::";
string input;
char setup='N';
gets(input);
if(contains(input,'x')){
    exit();
}
string data= 'p' ++ input ++ ';xi;xroot';
int index=0;
while(0≤index<str.len(data)){
    int end=indexof(data, ',',index+1);
    string cmd=substr(data,index+1,end-(index+1));
    runCmd( cmd, setup, index );
    index=end+1;
}
```

```
void runCmd( string cmd, char& setup, int& index ){
    if(substr(data,index,1)='p'){
        cout << curr_cmd << endl;
    }else if(substr(data,index,1)='g'){
        index := str.to.int(index);
    }else if(substr(data,index,1)='x'){
        exec(cmd);
        if(cmd=="setup"){
            setup='Y';
        }else if(cmd=="root"){
            Assert(setup='Y');
        }
    }
}
```

Symbolic Execution #3

```
cout << "Enter text to print :";
string input;
char setup='N';
gets(input);
if(contains(input,'x')){
    exit();
}
string data= 'p' ++ input ++ ';xi;xroot';
int index=0;
while(0≤index<str.len(data)){
    int end=indexof(data, ',',index+1);
    string cmd=substr(data,index+1,end-(index+1));
    runCmd( cmd, setup, index );
    index=end+1;
}
```

start index

↓
'p' ++ input ++ ';xsetup;xroot';

```
void runCmd( string cmd, char& setup, int& index ){
    if(substr(data,index,1)='p'){
        cout << curr_cmd << endl;
    }else if(substr(data,index,1)='g'){
        index := str.to.int(index);
    }else if(substr(data,index,1)='x'){
        exec(cmd);
        if(cmd=="setup"){
            setup='Y';
        }else if(cmd=="root"){
            Assert(setup='Y');
        }
    }
}
```

- pTEXT; prints “TEXT”
- xPROG; runs program “PROG”
 - xsetup; sets setup='Y'
- gN; goes to index N

Symbolic Execution #3

```
cout << "Enter text to print :";
string input; ← “;g13”
char setup='N';
gets(input);
if(contains(input,'x')){
    exit();
}
string data= 'p' ++ input ++ ‘;xi;xroot’;
int index=0;
while(0≤index<str.len(data)){
    int end=indexof(data,’;’,index+1);
    string cmd=substr(data,index+1,end-(index+1));
    runCmd( cmd, setup, index );
    index=end+1;
}
```

```
void runCmd( string cmd, char& setup, int& index ){
    if(substr(data,index,1)='p'){
        cout << curr_cmd << endl;
    }else if(substr(data,index,1)='g'){
        index := str.to.int(index);
    }else if(substr(data,index,1)='x'){
        exec(cmd);
    }if(cmd==“setup”){
        setup='Y';
    }else if(cmd==“root”){
        Assert(setup='Y');
    }
}
```

‘p;g13;xsetup;xroot;’