

SMT Solvers for Verification and Synthesis

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VTSA Summer School

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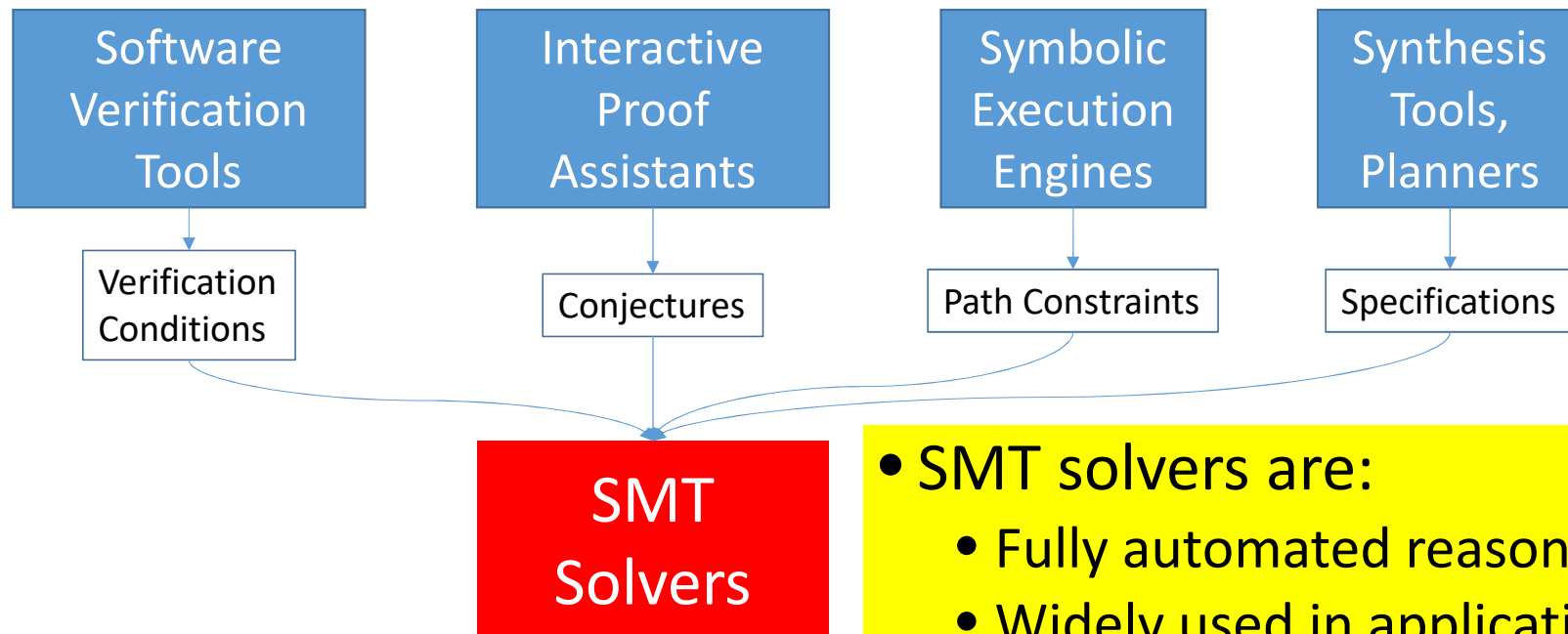
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Acknowledgements

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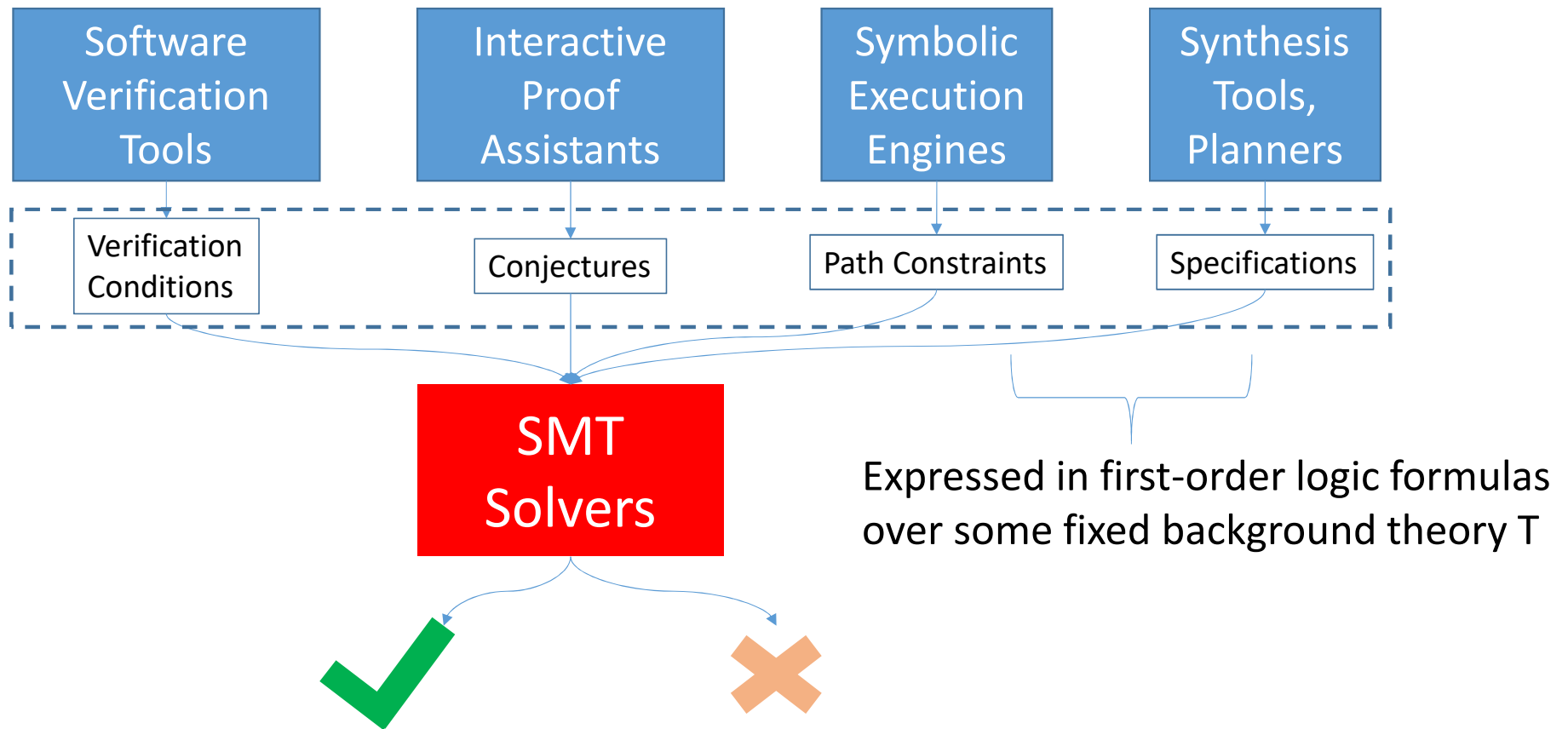


Satisfiability Modulo Theories (SMT) Solvers



- SMT solvers are:
 - Fully automated reasoners
 - Widely used in applications

Satisfiability Modulo Theories (SMT) Solvers



Contract-Based Software Verification

```
@precondition:  $x_{in} > y_{in}$ 
void swap(int x, int y)
{
    x := x + y;
    y := x - y;
    x := x - y;
}
```

...does this function ensure that $x_{out} = y_{in} \wedge y_{out} = x_{in}$?

Software Verification Tools

Contract-Based Software Verification

```
@precondition:  $x_{in} > Y_{in}$ 
void swap(int x, int y)
{
    x := x + y;
    y := x - y;
    x := x - y;
}
```

...does this function ensure that $x_{out} = Y_{in} \wedge Y_{out} = x_{in}$?

Software Verification Tools

```
 $x_{in} > Y_{in}$ 
 $x_2 = x_{in} + Y_{in} \wedge Y_2 = Y_{in}$ 
 $x_3 = x_2 \wedge Y_3 = x_2 - Y_2$ 
 $x_{out} = x_3 - Y_3 \wedge Y_{out} = Y_3$ 
( $x_{out} \neq Y_{in} \vee Y_{out} \neq x_{in}$ )
```

Pre-condition

Function Body

(Negated)
Post-condition

Contract-Based Software Verification

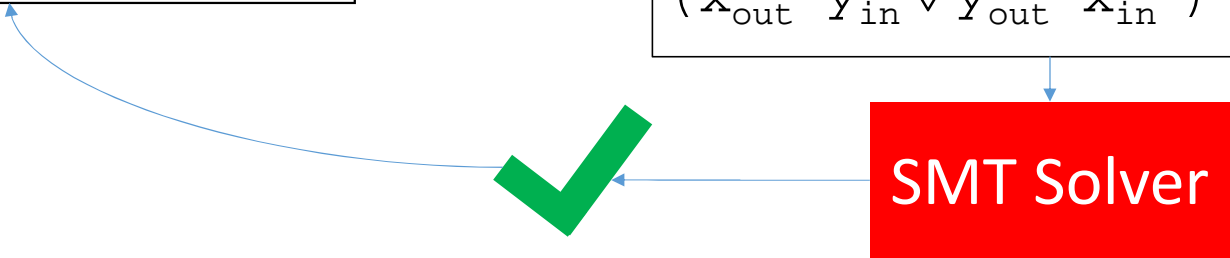
```
@precondition:  $x_{in} > y_{in}$ 
void swap(int x, int y)
{
    x := x + y;
    y := x - y;
    x := x - y;
}
@ensures
 $x_{out} = y_{in} \wedge y_{out} = x_{in}$ 
```

Software Verification Tools

$x_{in} > y_{in}$
 $x_2 = x_{in} + y_{in} \wedge y_2 = y_{in}$
 $x_3 = x_2 \wedge y_3 = x_2 - y_2$
 $x_{out} = x_3 - y_3 \wedge y_{out} = y_3$
 $(x_{out} = y_{in} \wedge y_{out} = x_{in})$

Pre-condition
Function Body
(Negated)
Post-condition

SMT Solver



Interactive Proof Assistants

Theorem `app_rev`:

forall (x : list) (y : list), rev append x y = append (rev y) (rev x).

Proof.

....does this theorem hold? What is the proof?

Interactive Proof
Assistant

Interactive Proof Assistants

Theorem `app_rev`:

`forall (x : list) (y : list), rev append x y = append (rev y) (rev x).`

Proof.

....does this theorem hold? What is the proof?

Interactive Proof Assistant

```
List := cons( head : Int, tail : List ) | nil
```

} **Signature**

```
 $\forall x:L. \text{length}(x) = \text{ite}(\text{is-cons}(x), 1 + \text{length}(\text{tail}(x)), 0)$ 
```

```
 $\forall xy:L. \text{append}(x) = \text{ite}(\text{is-cons}(x), \text{cons}(\text{head}(x), \text{append}(\text{tail}(x), y)), y)$ 
```

```
 $\forall x:L. \text{rev}(x) = \text{ite}(\text{is-cons}(x), \text{append}(\text{rev}(\text{tail}(x)), \text{cons}(\text{head}(x), \text{nil})), \text{nil})$ 
```

} **Axioms**

```
 $\exists xy:L. \text{rev}(\text{append}(x, y)) \neq \text{append}(\text{rev}(y), \text{rev}(x))$ 
```

} **(Negated) conjecture**

Interactive Proof Assistants

Theorem `app_rev`:

`forall (x : list) (y : list), rev append x y = append (rev y) (rev x).`

Proof.

`case is-cons x: rev append x y = by rev-def`

...

`case is-nil x:`

`append x y = y by append-def`

`rev x = nil by rev-def`

`m rev append x y = append (rev y) (rev x) by simplify`

QED.

Interactive Proof Assistant

`tail : List) | nil`

Signature

`end(tail(x),y),y)`
`cons(head(x),nil),nil)`

Axioms

`∃xy:L.rev(append(x,y))≠append(rev(y),rev(x))`

(Negated) conjecture

SMT Solver



Symbolic execution

```
char buff[15];
char pass;
cout << "Enter the password :";
gets(buff);
if (regex_match(buff, std::regex("[A-Z]+"))) {
    if(strcmp(buff, "PASSWORD")) {
        cout << "Wrong Password";
    } else {
        cout << "Correct Password";
        pass = 'Y';
    }
}
if(pass == 'Y') {
    grant_root_permission();
    Assert(strcmp(buff,"PASSWORD")==0);
}
}
```

Does this assertion hold
for all executions?

Symbolic Execution
Engine

Symbolic execution

```
char buff[15];
char pass;
cout << "Enter the password :";
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}
if(pass == 'Y') {
    grant_root_permission();
    Assert(strcmp(buff,"PASSWORD")==0);
}
}
```

Does this assertion hold
for all executions?

Symbolic Execution
Engine

```
...
(assert (and (= (str.len buff) 15) (= (str.len pass1) 1)))
(assert (or (< (str.len input) 15) (= input (str.++ buff pass0 rest))))
(assert (str.in.re buff (re.+ (re.range "A" "Z"))))
(assert (and (not (= buff "PASSWORD")) (= pass1 pass0)))
(assert (= pass1 "Y"))
(assert (not (= buff "PASSWORD")))
```

Symbolic execution

```
char buff[15];
char pass;
cout << "Enter the password :";
gets(buff);
if (regex_match(buff, std::regex("[A-Z]+"))) {
    if(strcmp(buff, "PASSWORD")) {
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}
if(pass == 'Y') {
    grant_root_permission();
    Assert(strcmp(buff,"PASSWORD")==0);
}
}
```

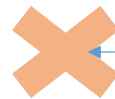
```
(define-fun input () String "AAAAAAAAAAAAAAAAAY")
(define-fun buff () String "AAAAAAAAAAAAAAAA")
(define-fun pass () String "Y")
```

Does this assertion hold
for all executions?

Symbolic Execution
Engine

```
...
(assert (and (= (str.len buff) 15) (= (str.len pass1) 1)))
(assert (or (< (str.len input) 15) (= input (str.++ buff pass0 rest))))
(assert (str.in.re buff (re.+ (re.range "A" "Z"))))
(assert (and (not (= buff "PASSWORD")) (= pass1 pass0)))
(assert (= pass1 "Y"))
(assert (not (= buff "PASSWORD")))
```

SMT Solver



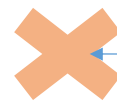
Symbolic execution

```
char buff[15];
char pass;
cout << "Enter the password :";
gets(buff); ← "AAAAAAAAAAAAAAAY"
if (regex_match(buf, std::regex("[A-Z]+"))) {
    if(strcmp(buff, "PASSWORD")) {
        cout << "Wrong Password";
    } else {
        cout << "Correct Password";
        pass = 'Y';
    }
}
if(pass == 'Y') {
    grant_root_permission();
    Assert(strcmp(buff,"PASSWORD")==0);
}
```

```
(define-fun input () String "AAAAAAAAAAAAAAAY")
(define-fun buff () String "AAAAAAAAAAAAAA")
(define-fun pass () String "Y")
```

Symbolic Execution Engine

```
...
(assert (and (= (str.len buff) 15) (= (str.len pass1) 1)))
(assert (or (< (str.len input) 15) (= input (str.++ buff pass0 rest))))
(assert (str.in.re buff (re.+ (re.range "A" "Z"))))
(assert (and (not (= buff "PASSWORD")) (= pass1 pass0)))
(assert (= pass1 "Y"))
(assert (not (= buff "PASSWORD")))
```



SMT Solver

Synthesis Tools

```
void maxList(List a, List b, List& c)
{
  int max;
  for(i=0;i<a.size();i++){
    max = choose(x => x ≥ a[i] ∧ x ≥ b[i]);
    c := c.append(max);
  }
  return c;
}
@ensures:  $\forall i. (c_{out}[i] \geq a[i] \wedge c_{out}[i] \geq b[i])$  ?
```

Find an x that satisfies specification
 $x \geq a[i] \wedge x \geq b[i]$

Synthesis
Tools

Synthesis Tools

```
void maxList(List a, List b, List& c)
{
  int max;
  for(i=0;i<a.size();i++){
    max = choose(x => x≥a[i]∧x≥b[i]);
    c := c.append(max);
  }
  return c;
}
@ensures: ∀i.(cout[i]≥a[i]∧cout[i]≥b[i]) ?
```

Find an x that satisfies specification
 $x \geq a[i] \wedge x \geq b[i]$

Synthesis
Tools

Is $\text{ite}(a[i] \geq b[i], a[i], b[i])$
a solution?

$\neg(\text{ite}(a[i] \geq b[i], a[i], b[i]) \geq a[i] \wedge$
 $\text{ite}(a[i] \geq b[i], a[i], b[i]) \geq b[i])$

Synthesis Tools

```
void maxList(List a, List b, List& c)
{
  int max;
  for(i=0;i<a.size();i++){
    max = if(a[i]!b[i]{a[i]}else{b[i]};
    c := c.append(max);
  }
  return c;
}
@ensures:  $\exists i.(c_{out}[i]!a[i] \vee c_{out}[i]!b[i])$ 
```

Synthesis Tools

Is $\text{ite}(a[i] \geq b[i], a[i], b[i])$
a solution?

$\neg(\text{ite}(a[i] \geq b[i], a[i], b[i]) \geq a[i] \wedge$
 $\text{ite}(a[i] \geq b[i], a[i], b[i]) \geq b[i])$

SMT Solver



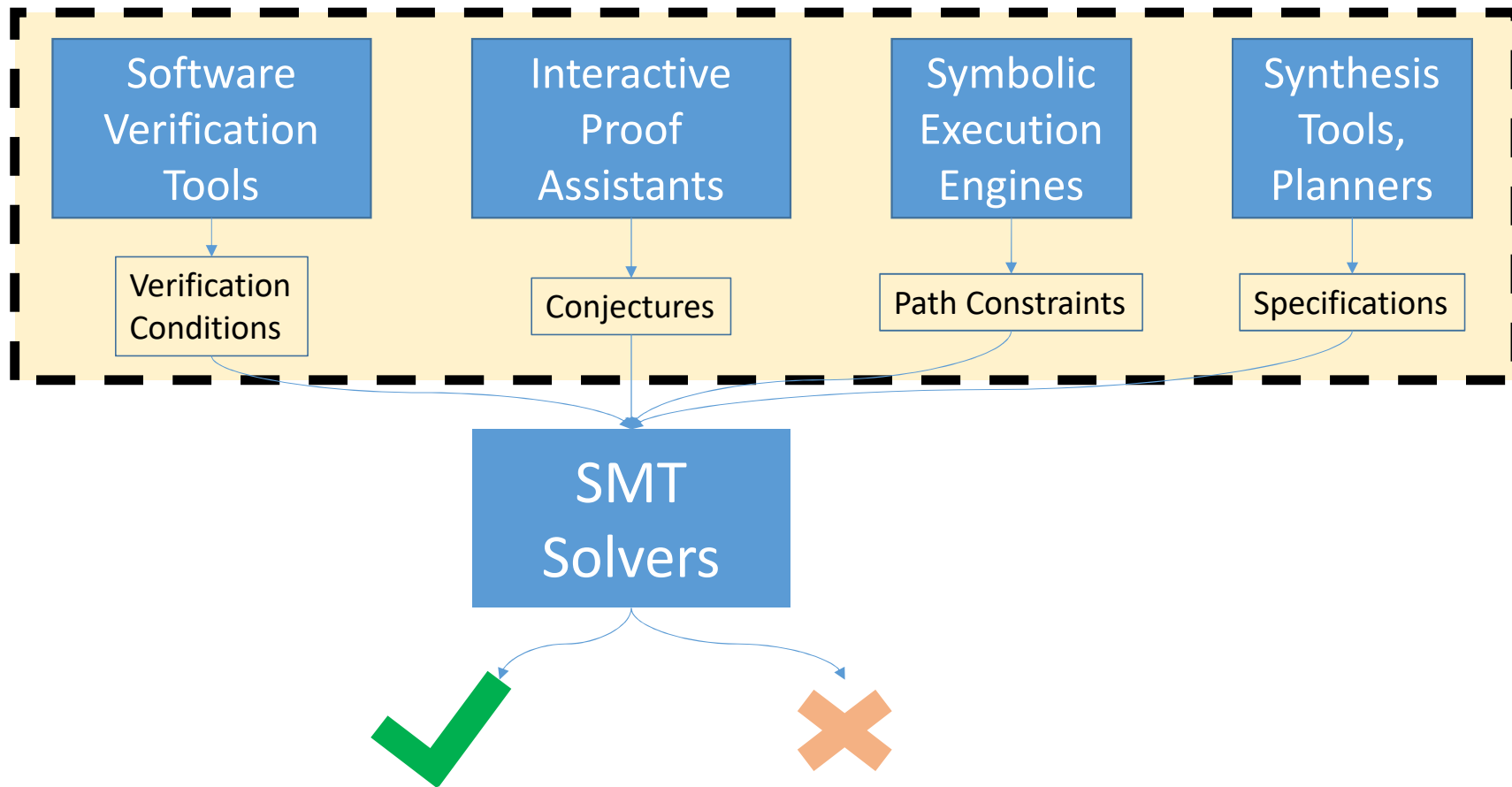
Constraints Supported by SMT Solvers

- 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: `select(A, i) = select(store(A, i+1, 3), i)`
 - Bit-vectors: `bvule(x, #xFF)`
 - Algebraic Datatypes: `x, y: List; tail(x) = cons(0, y)`
 - Unbounded Strings: `x, y: String; y = substr(x, 0, len(x) - 1)`
 - ...
 - \forall over each of these

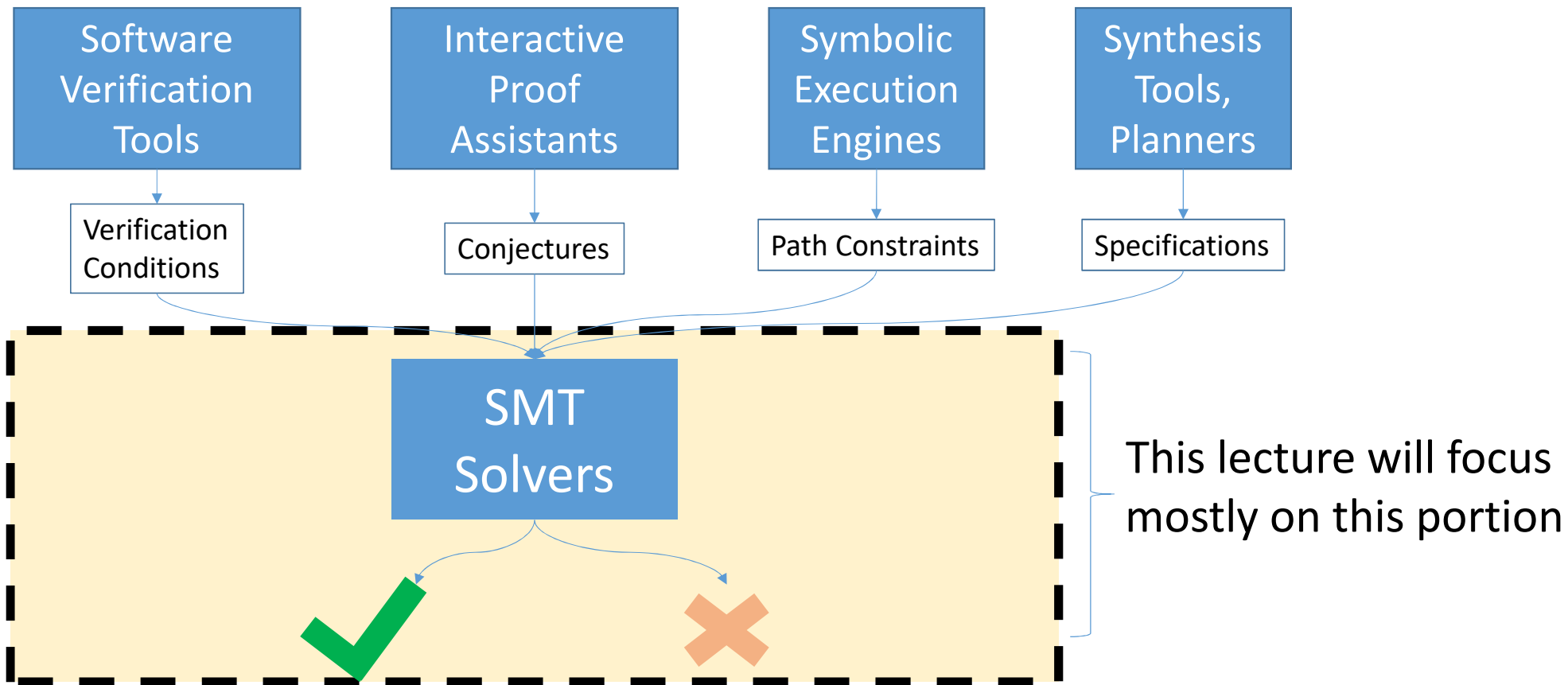
Constraints Supported by SMT Solvers

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

Satisfiability Modulo Theories (SMT) Solvers



Satisfiability Modulo Theories (SMT) Solvers



Overview

- Satisfiability Modulo Theories (SMT) solvers: **how they work**
 - DPLL, DPLL(T), decision procedures, Nelson-Oppen combination, quantifier instantiation
- **How to use** SMT solvers
 - `smt2` language, models, proofs, unsat cores, incremental mode
- Things that SMT solvers can (and cannot) do well

Overview

- **Part 1** : DPLL and DPLL(T) for SAT (modulo theories)
 - Applications : Contract-based program verification, Symbolic Execution
- **Part 2** : Extension to quantified formulas $\forall\exists$
 - Applications : Inductive theorem proving, Finite Model finding, Synthesis

- Can download CVC4 binary: <http://cvc4.cs.stanford.edu/downloads/>
 - Use development version on right hand side
- ...or clone from github: <https://github.com/CVC4/CVC4>
- Lecture material available:
<http://homepage.cs.uiowa.edu/~ajreynol/VTSA2017/>

