

# *The Strategy Challenge in SMT Solving (part I)*

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# Satisfiability Modulo Theories (SMT)

A Satisfiability Checker  
with built-in support for useful theories

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$$b + 2 = c \text{ and } f(\text{read}(\text{write}(a, b, 3), c-2) \neq f(c-b+1)$$

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Arithmetic

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Array Theory

# Satisfiability Modulo Theories (SMT)

$$b + 2 = c \text{ and } f(\text{read}(\text{write}(a, b, 3), c - 2) \neq f(c - b + 1)$$

Uninterpreted  
Functions

# Main challenges

- Scalability (huge formulas)
- Complexity
- Undecidability
- Quantified formulas
- Nonlinear arithmetic



# SMT $\rightarrow$ SAT Abstraction/Refinement

## Basic Idea

$$x \geq 0, y = x + 1, (y > 2 \vee y < 1)$$



Abstract (aka “naming” atoms)

$$p_1, p_2, (p_3 \vee p_4) \quad \begin{array}{l} p_1 \equiv (x \geq 0), p_2 \equiv (y = x + 1), \\ p_3 \equiv (y > 2), p_4 \equiv (y < 1) \end{array}$$



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SAT  
Solver

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Assignment

$p_1, p_2, \neg p_3, p_4$

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$$x \geq 0, y = x + 1, \\ \neg(y > 2), y < 1$$

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# SMT $\rightarrow$ SAT Abstraction/Refinement

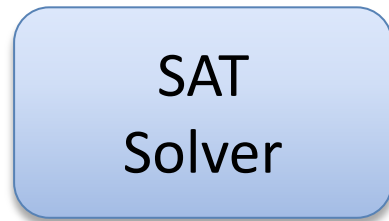
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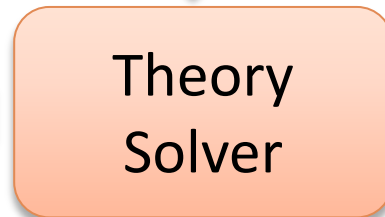


Unsatisfiable

$$x \geq 0, y = x + 1, y < 1$$



Theory  
Solver



# SMT $\rightarrow$ SAT Abstraction/Refinement

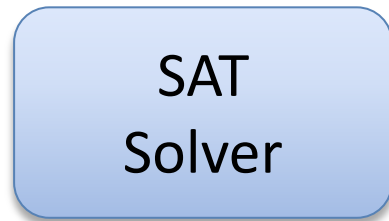
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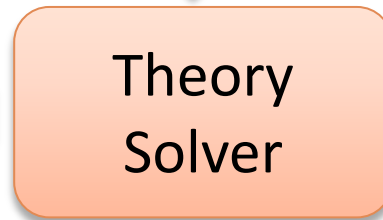
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Unsatisfiable



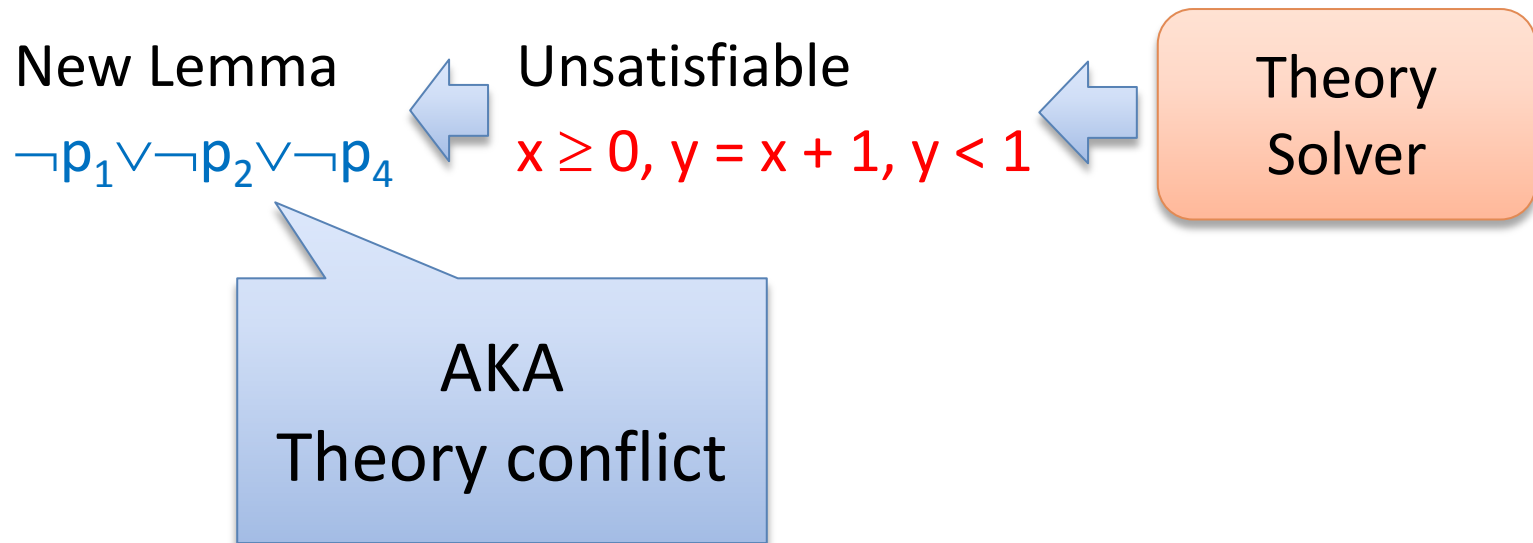
$$x \geq 0, y = x + 1, y < 1$$



New Lemma

$$\neg p_1 \vee \neg p_2 \vee \neg p_4$$

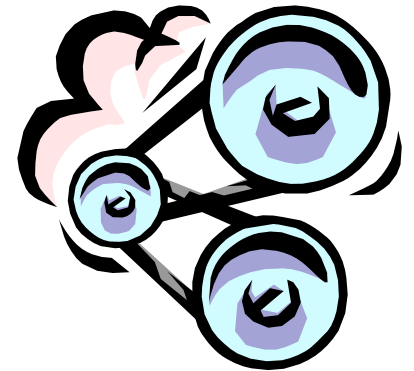
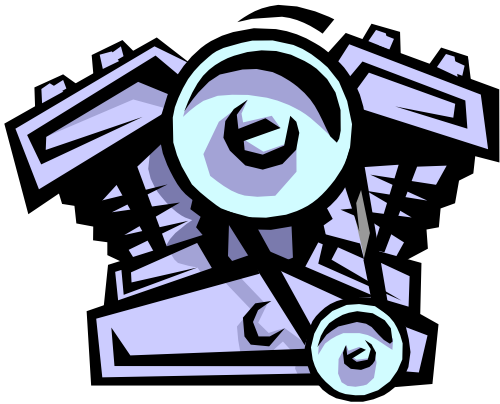
# SMT $\rightarrow$ SAT Abstraction/Refinement



# Orchestrating Decision Engines

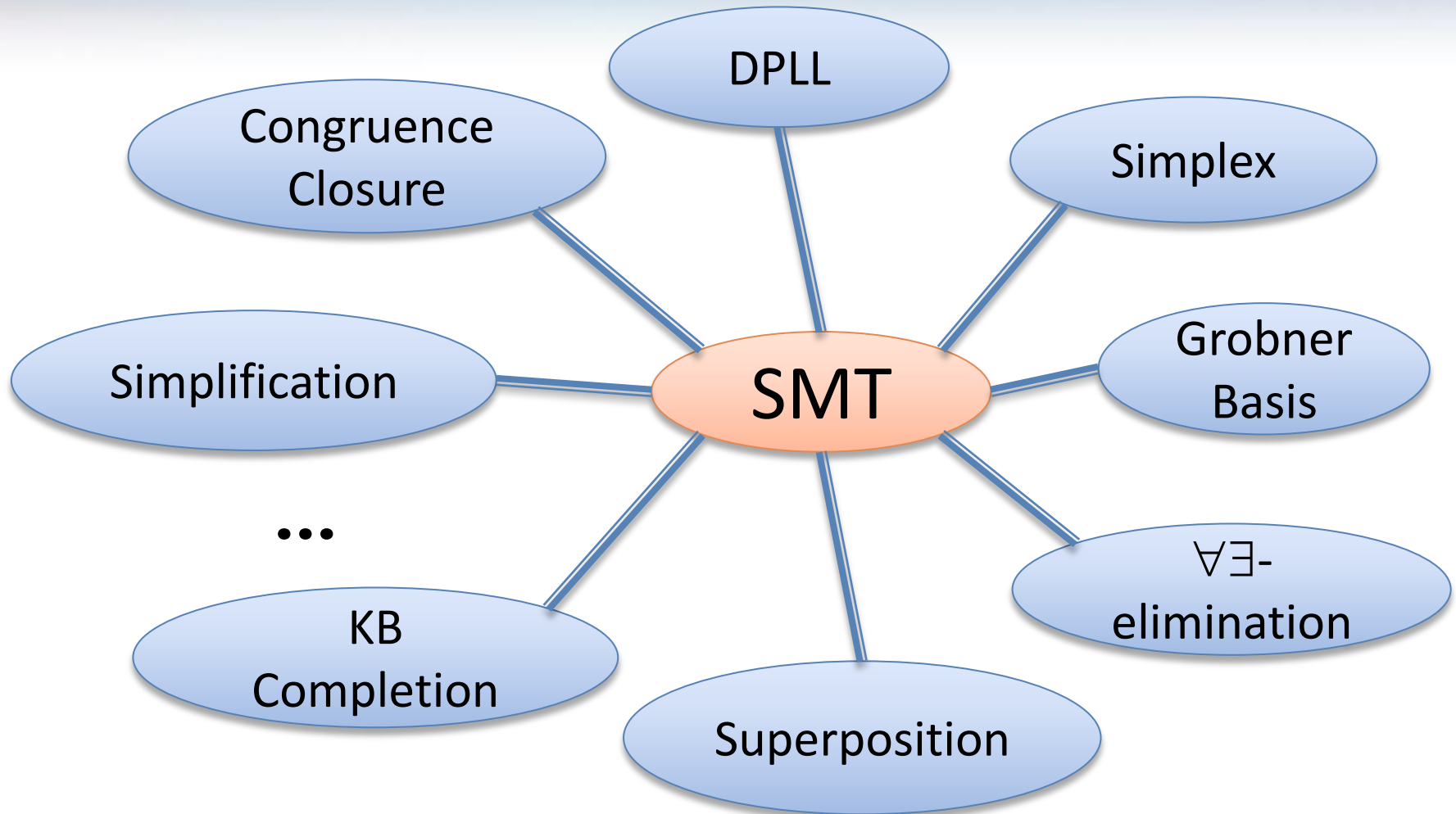
# Combining Engines

Current SMT solvers provide  
**a combination**  
of different engines

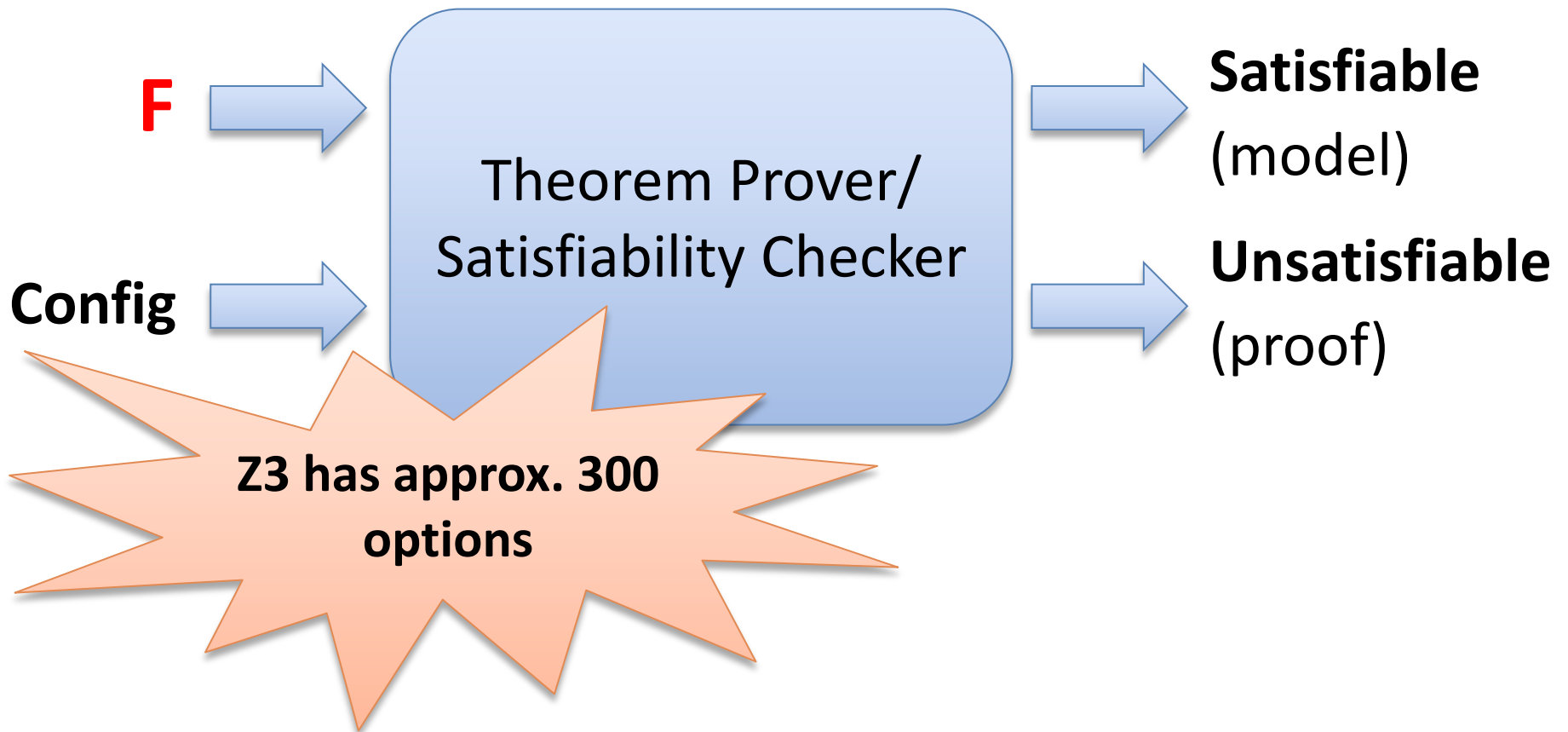




# Combining Engines



# Configuring SAT/SMT Solvers: “state-of-the-art”



# Opening the “Black Box”

Actual feedback provided by Z3 users:

“Could you send me your CNF converter?”

“I want to implement my own search strategy.”

“I want to include these rewriting rules in Z3.”

“I want to apply a substitution to term  $t$ .”

“I want to compute the set of implied equalities.”

# The Strategy Challenge

To build theoretical and practical tools  
allowing users to exert strategic control  
over core heuristic aspects of high  
performance SMT solvers.

# What is a strategy?

Theorem proving as an exercise of combinatorial search

**Strategies** are **adaptations** of general search mechanisms which **reduce** the **search space** by tailoring its exploration to a **particular class** of formulas.

# The Need for “Strategies”

Different Strategies for Different Domains.

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Different Strategies for Different Domains.

From timeout to 0.05 secs...

# Example in Quantified Bit-Vector Logic (QBFV)

Join work with C. Wintersteiger and Y. Hamadi  
FMCAD 2010

QBFV = Quantifiers + Bit-vectors + uninterpreted functions

Hardware Fixpoint Checks.

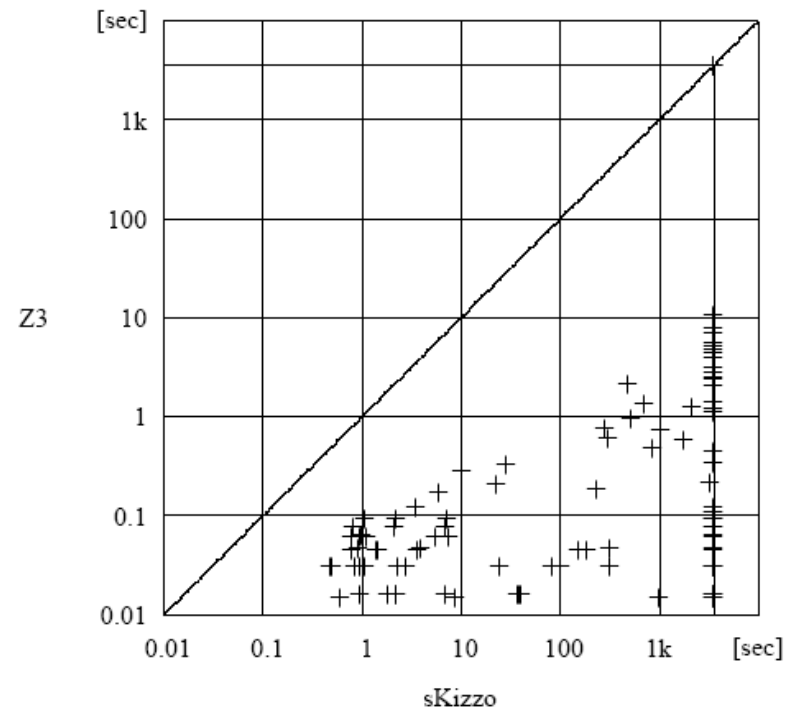
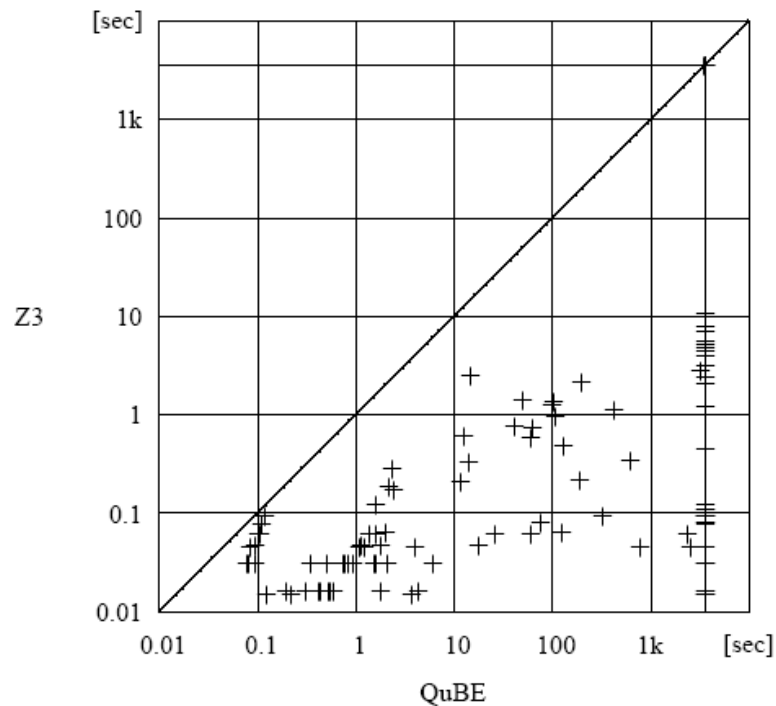
Given:  $I[x]$  and  $T[x, x']$

$$\forall x, x' . I[x] \wedge T^k[x, x'] \rightarrow \exists y, y' . I[y] \wedge T^{k-1}[y, y']$$

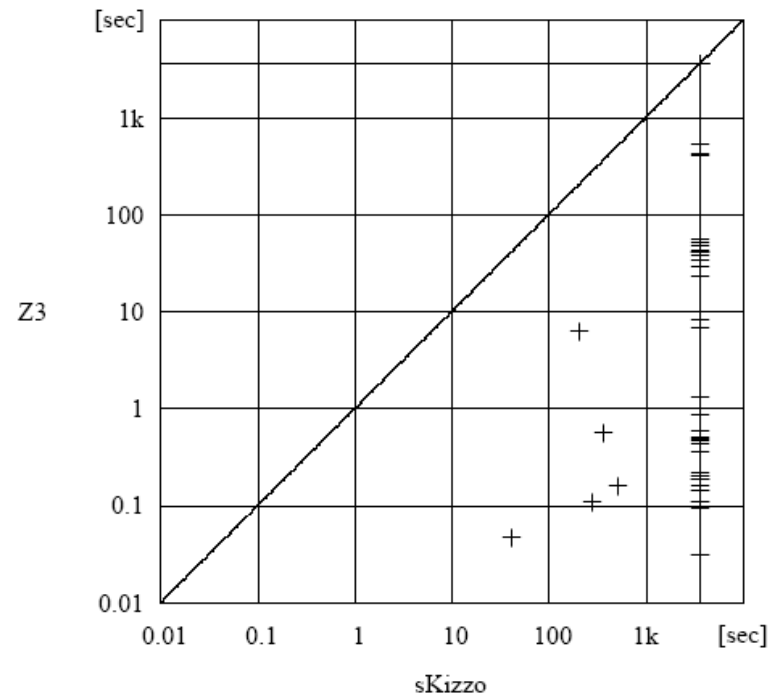
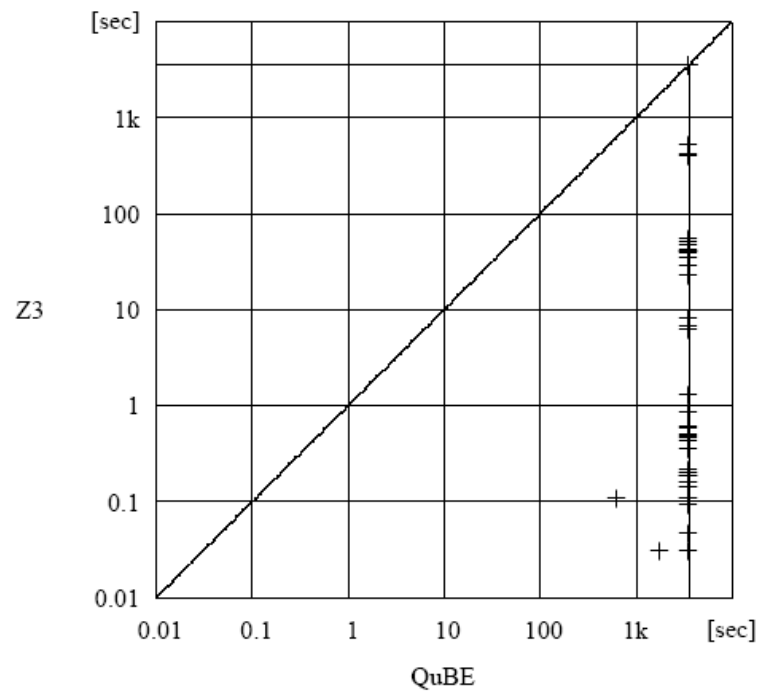
Ranking function synthesis.



# Hardware Fixpoint Checks



# Ranking Function Synthesis



# Why is Z3 so fast in these benchmarks?

Z3 is using different engines:

rewriting, simplification, model checking, SAT, ...

Z3 is using a customized **strategy**.

We could do it because  
we have access to the source code.

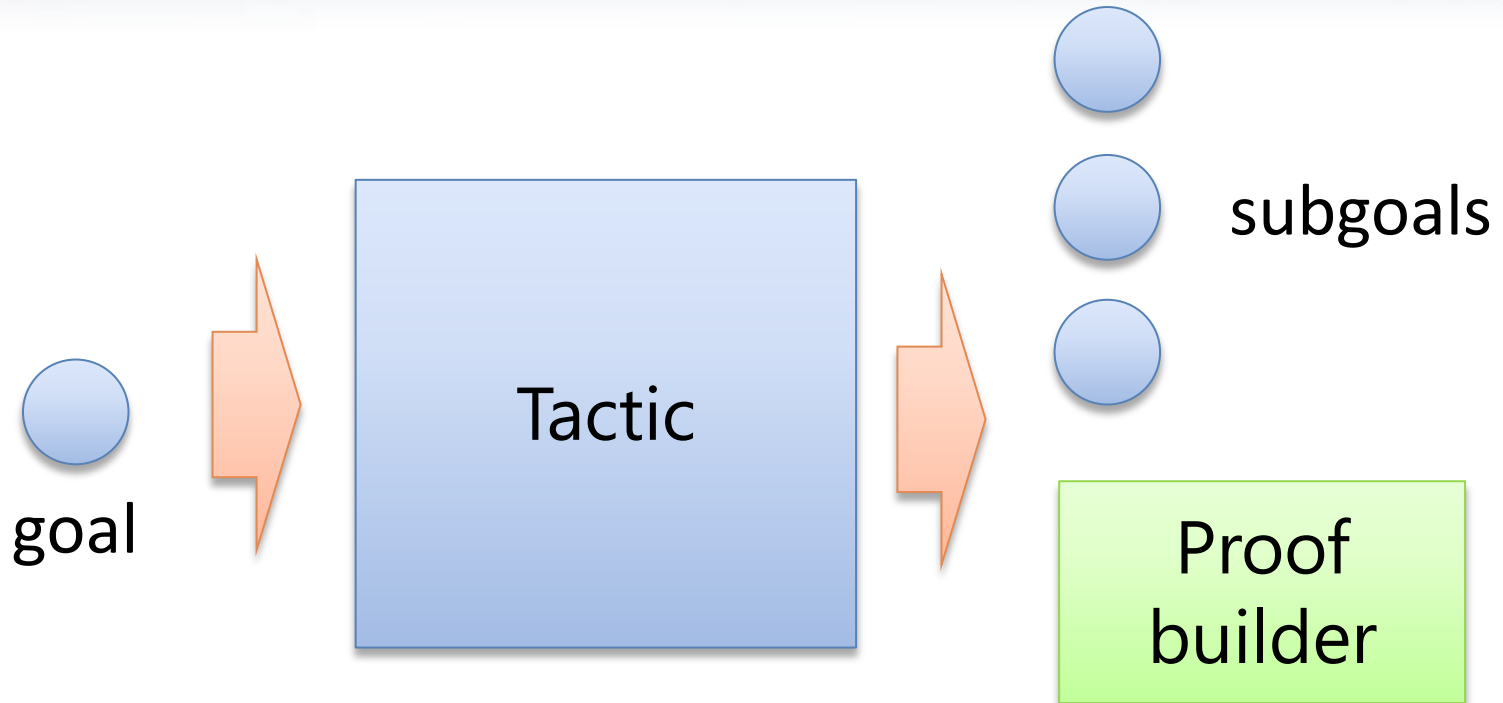
# The "Message"

SMT solvers are collections of little engines.

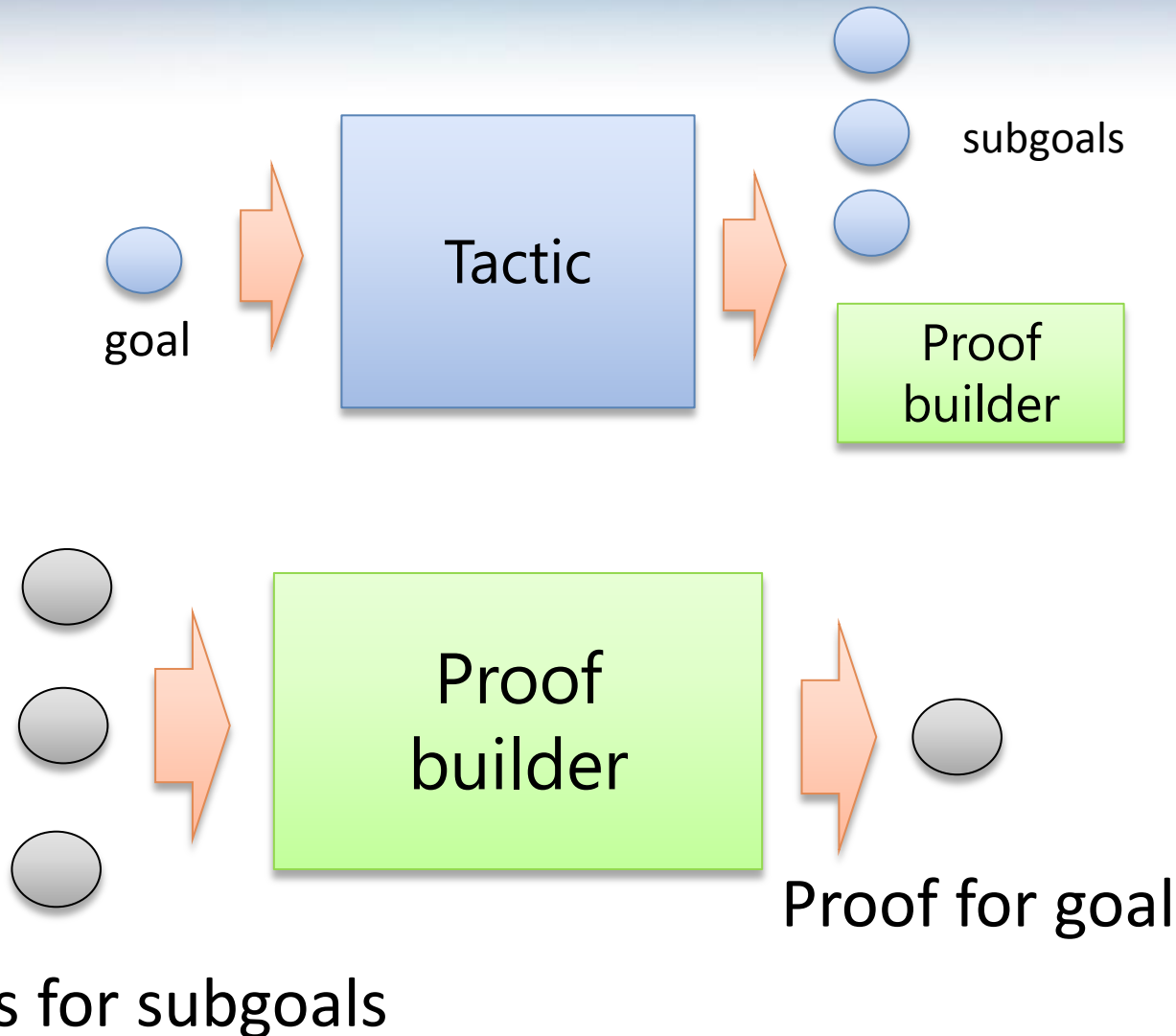
They should provide access to these engines.

Users should be able to define their own strategies.

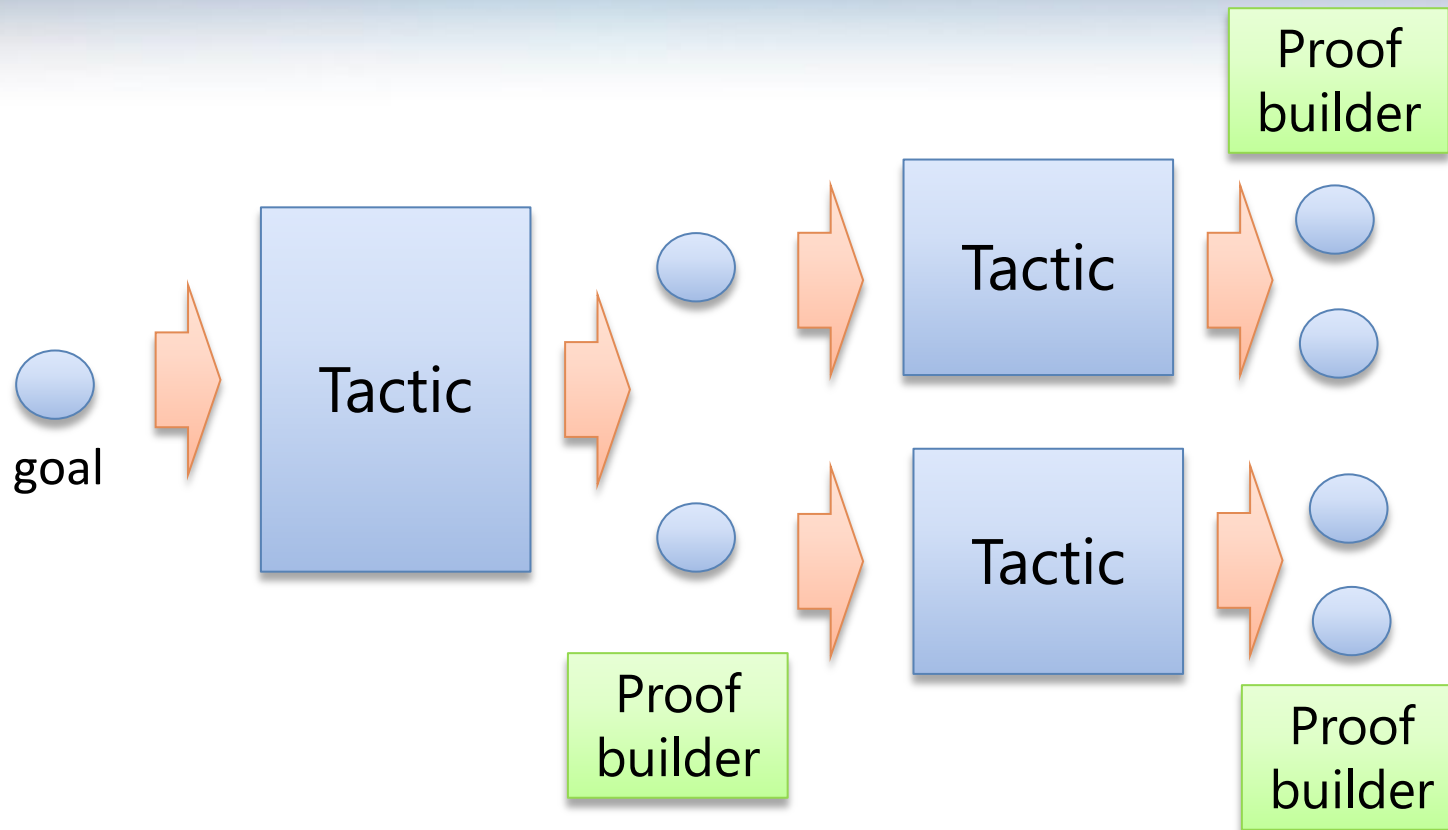
# Main inspiration: LCF-approach



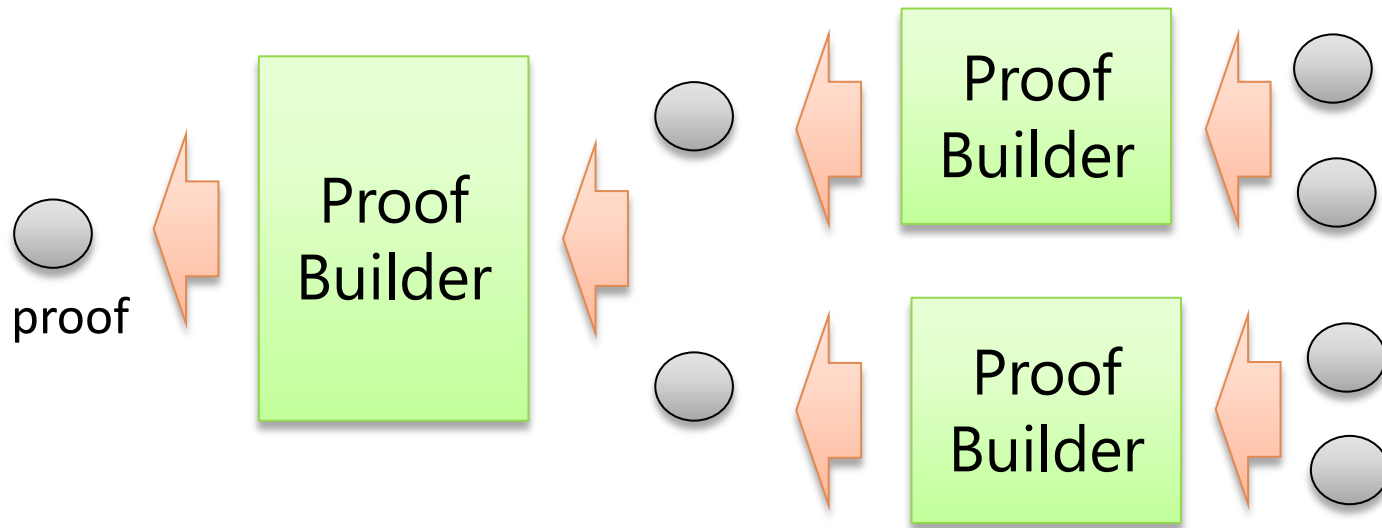
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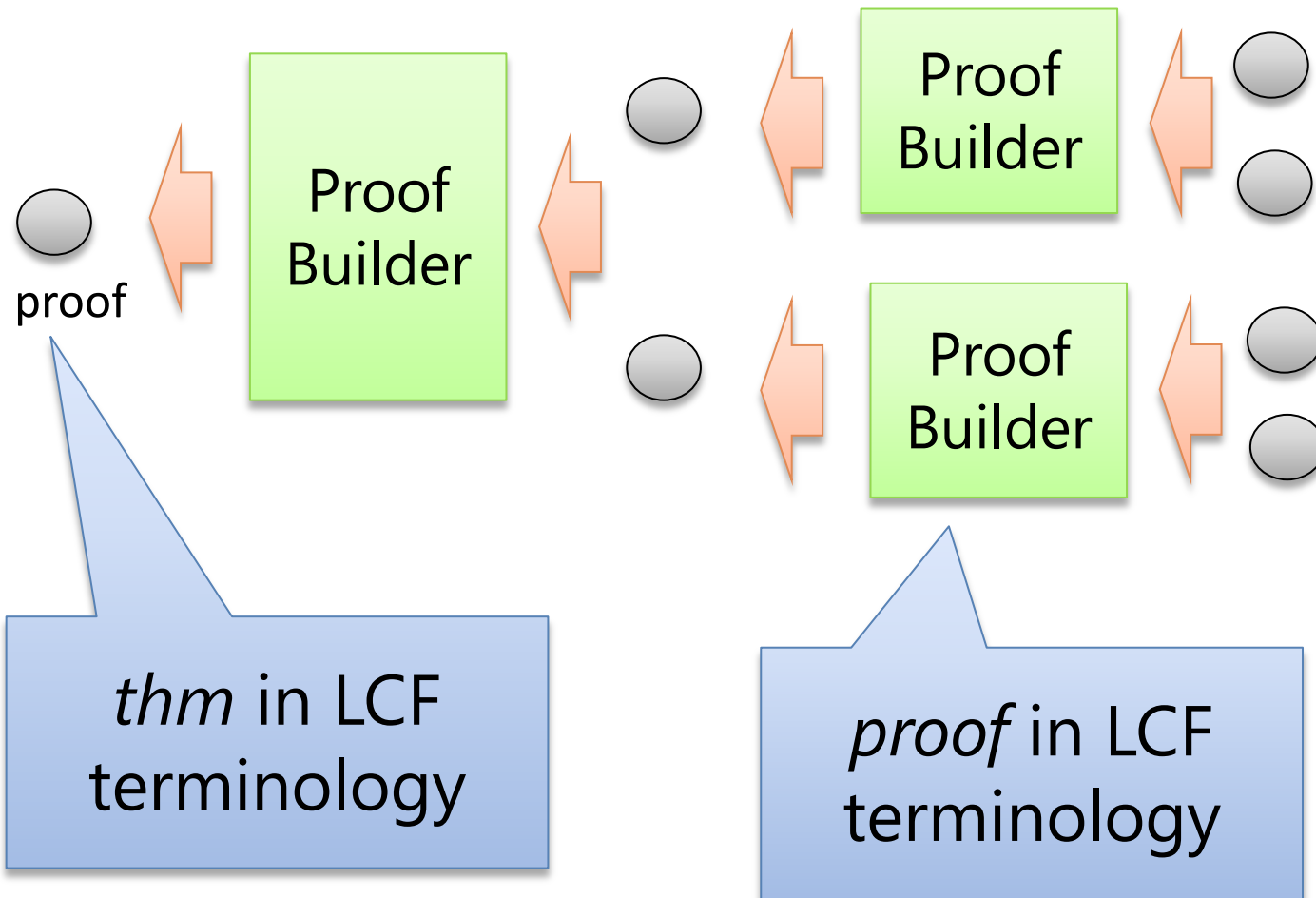


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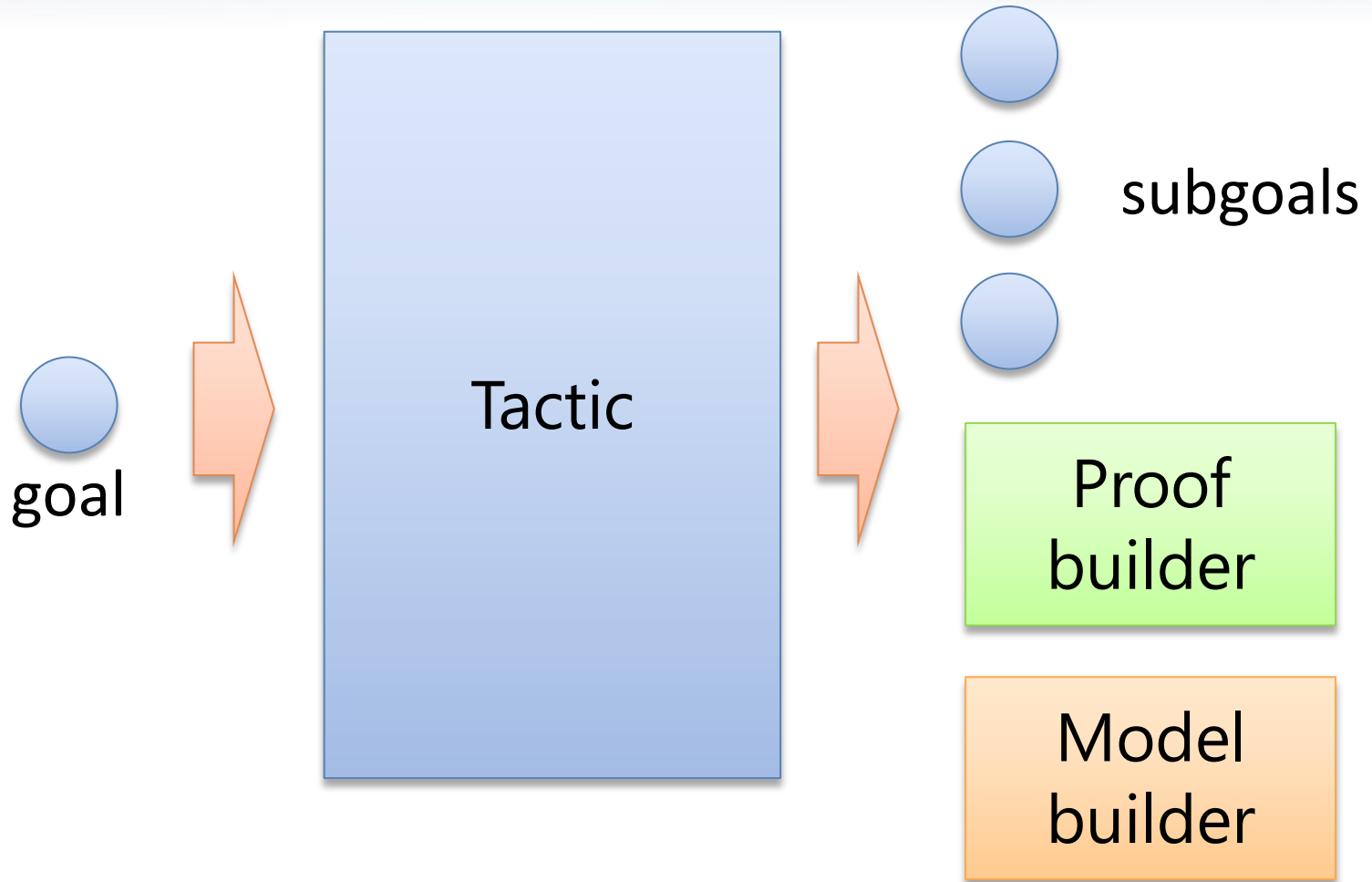
# Tacticals aka Combinators

then(  ,  ) = 

orelse(  ,  ) = 

repeat(  ) = 

# SMT Tactic



# SMT Tactic

*goal* = *formula sequence*  $\times$  *attribute sequence*

*proofconv* = *proof sequence*  $\rightarrow$  *proof*

*modelconv* = *model*  $\times$  *nat*  $\rightarrow$  *model*

*trt* = **sat** *model*

| **unsat** *proof*

| **unknown** *goal sequence*  $\times$  *modelconv*  $\times$  *proofconv*

| **fail**

*tactic* = *goal*  $\rightarrow$  *trt*

# SMT Tactic

*goal* = *formula sequence*  $\times$  *attribute sequence*

*proofconv* = *proof sequence*  $\rightarrow$  *proof*

*modelconv* = *model*  $\times$  *nat*  $\rightarrow$  *model*

*trt* = **sat** *model*

| **unsat** *proof*

| **unknown** *goal sequence*  $\times$  *modelconv*  $\times$  *proofconv*

| **fail**

*tactic* = *goal*  $\rightarrow$  *trt*

**end-game tactics:**

never return unknown(sb, mc, pc)

# SMT Tactic

*goal* = *formula sequence*  $\times$  *attribute sequence*

*proofconv* = *proof sequence*  $\rightarrow$  *proof*

*modelconv* = *model*  $\times$  *nat*  $\rightarrow$  *model*

*trt* = **sat** *model*

| **unsat** *proof*

| **unknown** *goal sequence*  $\times$  *modelconv*  $\times$  *proofconv*

| **fail**

*tactic* = *goal*  $\rightarrow$  *trt*

**non-branching tactics:**

sb is a singleton in  
`unknown(sb, mc, pc)`

# Trivial goals

Empty goal [ ] is trivially satisfiable

False goal [ ..., false, ...] is trivially unsatisfiable

basic : tactic

# SMT Tactic example

$[ a = b + 1, (a < 0 \vee a > 0), b > 3 ]$



Tactic:  
elim-vars



Proof  
builder

$[ (b + 1 < 0 \vee b + 1 > 0), b > 3 ]$

Model  
builder



# SMT Tactic example

$[ a = b + 1, (a < 0 \vee a > 0), b > 3 ]$



Tactic:  
elim-vars



$[ (b + 1 < 0 \vee b + 1 > 0), b > 3 ]$

Proof  
builder

$M, M(a) = M(b) + 1$



Model  
builder



M

# SMT Tactic example

$[ a = b + 1, (a < 0 \vee a > 0), b > 3 ]$



Tactic:  
split-or



Proof  
builder

$[ a = b + 1, a < 0, b > 3 ]$

$[ a = b + 1, a > 0, b > 3 ]$

Model  
builder

# SMT Tactics

simplify

nnf

cnf

tseitin

lift-if

bitblast

gb

vts

propagate-bounds

propagate-values

split-ineqs

split-eqs

rewrite

p-cad

sat

solve-eqs

# SMT Tacticals

$\text{then} : (\text{tactic} \times \text{tactic}) \rightarrow \text{tactic}$

$\text{then}(t_1, t_2)$  applies  $t_1$  to the given goal and  $t_2$  to every subgoal produced by  $t_1$ .

$\text{then}^* : (\text{tactic} \times \text{tactic sequence}) \rightarrow \text{tactic}$

$\text{then}^*(t_1, [t_{2_1}, \dots, t_{2_n}])$  applies  $t_1$  to the given goal, producing subgoals  $g_1, \dots, g_m$ .

If  $n \neq m$ , the tactic fails. Otherwise, it applies  $t_{2_i}$  to every goal  $g_i$ .

$\text{orelse} : (\text{tactic} \times \text{tactic}) \rightarrow \text{tactic}$

$\text{orelse}(t_1, t_2)$  first applies  $t_1$  to the given goal, if it fails then returns the result of  $t_2$  applied to the given goal.

$\text{par} : (\text{tactic} \times \text{tactic}) \rightarrow \text{tactic}$

$\text{par}(t_1, t_2)$  executes  $t_1$  and  $t_2$  in parallel.

# SMT Tacticals

$$\text{then}(\text{skip}, t) = \text{then}(t, \text{skip}) = t$$

$$\text{orelse}(\text{fail}, t) = \text{orelse}(t, \text{fail}) = t$$

# SMT Tacticals

$\text{repeat} : \text{tactic} \rightarrow \text{tactic}$

Keep applying the given tactic until no subgoal is modified by it.

$\text{repeatupto} : \text{tactic} \times \text{nat} \rightarrow \text{tactic}$

Keep applying the given tactic until no subgoal is modified by it, or the maximum number of iterations is reached.

$\text{tryfor} : \text{tactic} \times \text{seconds} \rightarrow \text{tactic}$

$\text{tryfor}(t, k)$  returns the value computed by tactic  $t$  applied to the given goal if this value is computed within  $k$  seconds, otherwise it fails.

# Strategies online

<http://rise4fun.com/z3/tutorial/strategies> (SMT 2.0)

<http://rise4fun.com/z3py/tutorial/strategies> (Python)

**Z3Py - strategies** Microsoft Research

[other tutorials](#) [close](#)

**Strategies**

- 1. [Introduction](#)
- 2. [Tactics](#)
- 3. [Probes](#)
- 4. [tutorials](#)

```
x, y = Reals('x y')
g = Goal()
g.add(x > 0, y > 0, x == y + 2)
print g

t1 = Tactic('simplify')
t2 = Tactic('solve-eqs')
t = Then(t1, t2)
print t(g)
```

[ask z3py](#)