

# Automated Reasoning for Systems Engineering

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# Future and Our Motivation

1. Automated reasoning, in particular theorem proving will remain central in software verification and program analysis.

The role of theorem proving in these areas will be growing.

2. Theorem provers will be used by a large number of users who do not understand theorem proving and by users with very elementary knowledge of logic.
3. Reasoning with both quantifiers and theories will remain the main challenge in practical applications of theorem proving (at least) for the next decade.
4. Theorem provers will be used in reasoning with very large theories. These theories will appear in knowledge mining and natural language processing.

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# Outline

Automated Theorem Proving - An Overview

Challenges of Automated Theorem Proving

# First-Order Theorem Proving. Example

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**More formally:** in a group “**assuming** that  $x^2 = 1$  for all  $x$  **prove** that  $x \cdot y = y \cdot x$  holds for all  $x, y$ .”

**What is implicit:** axioms of the group theory.

$$\forall x(1 \cdot x = x)$$

$$\forall x(x^{-1} \cdot x = 1)$$

$$\forall x \forall y \forall z((x \cdot y) \cdot z = x \cdot (y \cdot z))$$

# Formulation in First-Order Logic

Axioms (of group theory):  $\forall x(1 \cdot x = x)$   
 $\forall x(x^{-1} \cdot x = 1)$   
 $\forall x \forall y \forall z((x \cdot y) \cdot z = x \cdot (y \cdot z))$

Assumptions:  $\forall x(x \cdot x = 1)$

---

Conjecture:  $\forall x \forall y(x \cdot y = y \cdot x)$

# In the TPTP Syntax

The **TPTP** library (**T**housands of **P**roblems for **T**heorem **P**rovers), <http://www.tptp.org> contains a large collection of first-order problems. For representing these problems it uses the **TPTP syntax**, which is understood by all modern theorem provers, including our Vampire prover.

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First-Order Logic (FOL)	TPTP
$\perp, \top$	<code>\$false, \$true</code>
$\neg F$	<code>~F</code>
$F_1 \wedge \dots \wedge F_n$	<code>F1 &amp; ... &amp; Fn</code>
$F_1 \vee \dots \vee F_n$	<code>F1   ...   Fn</code>
$F_1 \rightarrow F_n$	<code>F1 =&gt; Fn</code>
$(\forall x_1) \dots (\forall x_n) F$	<code>! [X1, ..., Xn] : F</code>
$(\exists x_1) \dots (\exists x_n) F$	<code>? [X1, ..., Xn] : F</code>

## Example in the TPTP Syntax

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%---- 1 * x = x
fof(left_identity,axiom,(
  ! [X] : mult(e,X) = X )).
%---- i(x) * x = 1
fof(left_inverse,axiom,(
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%---- (x * y) * z = x * (y * z)
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%---- x * x = 1
fof(group_of_order_2,hypothesis,
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- ▶ Equality

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# Running a Theorem Prover on a TPTP file

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One can also run Vampire with various **options**. For example, save the group theory problem in a file `group.tptp` and try

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vampire --thanks ECSS group.tptp
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# Proof by Vampire (Slightly Modified)

Refutation found.

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270. $false [trivial inequality removal 269]
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125. mult(X2,X3) = mult(X3,X2) [superposition 21,90]
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7. ?[X0,X1]: mult(X0,X1) != mult(X1,X0) [ennf transformation 6]
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                                     [choice axiom]
7. ?[X0,X1]: mult(X0,X1) != mult(X1,X0) [ennf transformation 6]
6. ~![X0,X1]: mult(X0,X1) = mult(X1,X0) [negated conjecture 5]
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- ▶ Each inference derives a formula from zero or more other formulas;
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- ▶ **Proof by refutation**, generating and simplifying inferences, unused formulas ...

# Proof by Vampire (Slightly Modified)

Refutation found.

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270. $false [trivial inequality removal 269]
269. mult(sk0,sk1) != mult(sk0,sk1) [superposition 14,125]
125. mult(X2,X3) = mult(X3,X2) [superposition 21,90]
90. mult(X4,mult(X3,X4)) = X3 [forward demodulation 75,27]
75. mult(inverse(X3),e) = mult(X4,mult(X3,X4)) [superposition 22,19]
27. mult(inverse(X2),e) = X2 [superposition 21,11]
22. mult(inverse(X4),mult(X4,X5)) = X5 [forward demodulation 17,10]
21. mult(X0,mult(X0,X1)) = X1 [forward demodulation 15,10]
19. e = mult(X0,mult(X1,mult(X0,X1))) [superposition 12,13]
17. mult(e,X5) = mult(inverse(X4),mult(X4,X5)) [superposition 12,11]
15. mult(e,X1) = mult(X0,mult(X0,X1)) [superposition 12,13]
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# Vampire

- ▶ **Completely automatic:** once you started a proof attempt, it can only be interrupted by terminating the process.
- ▶ **Champion** of the CASC world-cup in first-order theorem proving: won CASC 38 times.



# What an Automated Theorem Prover is Expected to Do

## Input:

- ▶ a set of **axioms** (first order formulas) or clauses;
- ▶ a **conjecture** (first-order formula or set of clauses).

## Output:

- ▶ **proof** (hopefully).

# Proof by Refutation

Given a problem with axioms and assumptions  $F_1, \dots, F_n$  and conjecture  $G$ ,

1. negate the conjecture ( $\neg G$ );
2. establish **unsatisfiability** of the set of formulas  $F_1, \dots, F_n, \neg G$ .

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Thus, we reduce the theorem proving problem to the problem of **checking unsatisfiability**.

In this formulation the negation of the conjecture  $\neg G$  is treated like any other formula.

In fact, Vampire (and other provers) **internally treat conjectures differently, to make proof search more goal-oriented**.

# General Scheme (simplified)

- ▶ Read a problem;
- ▶ Determine **proof-search options** to be used for this problem;
- ▶ Preprocess the problem;
- ▶ Convert it into a normal form (CNF);
- ▶ Run a **saturation algorithm** on it, try to derive *false*.
- ▶ If *false* is derived, report the **result**, maybe including a refutation.

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Trying to derive *false* using a saturation algorithm is the **hardest part**, which in practice may not terminate or run out of memory.

# How to Establish Unsatisfiability?

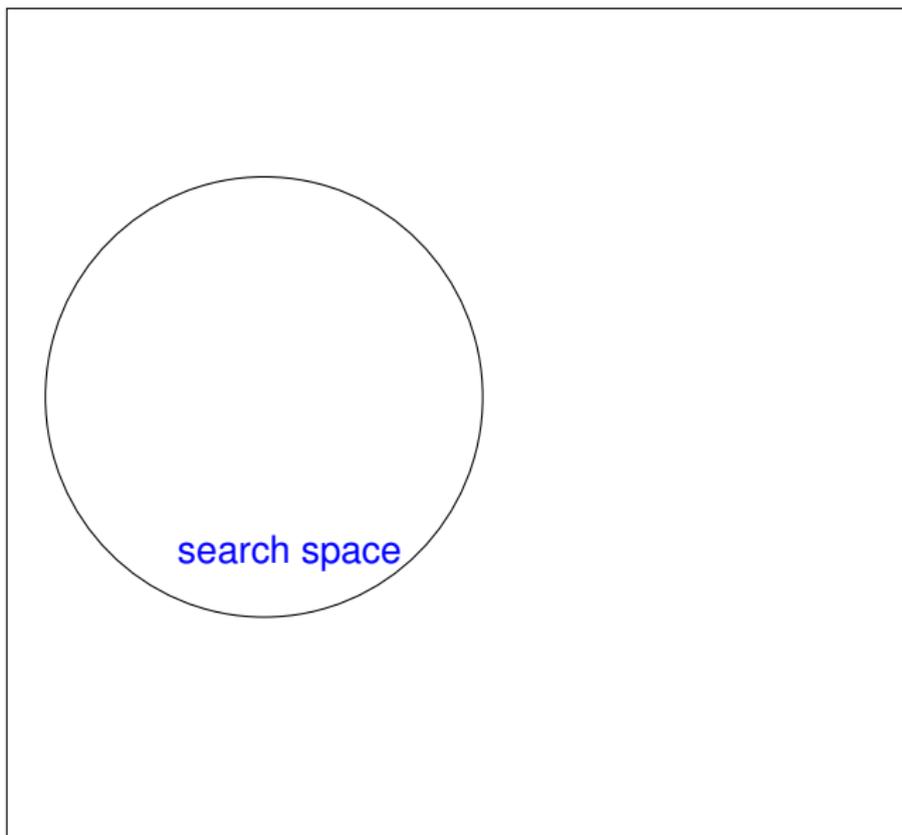
Idea:

- ▶ Take a set of clauses  $S$  (the **search space**), initially  $S = S_0$ .

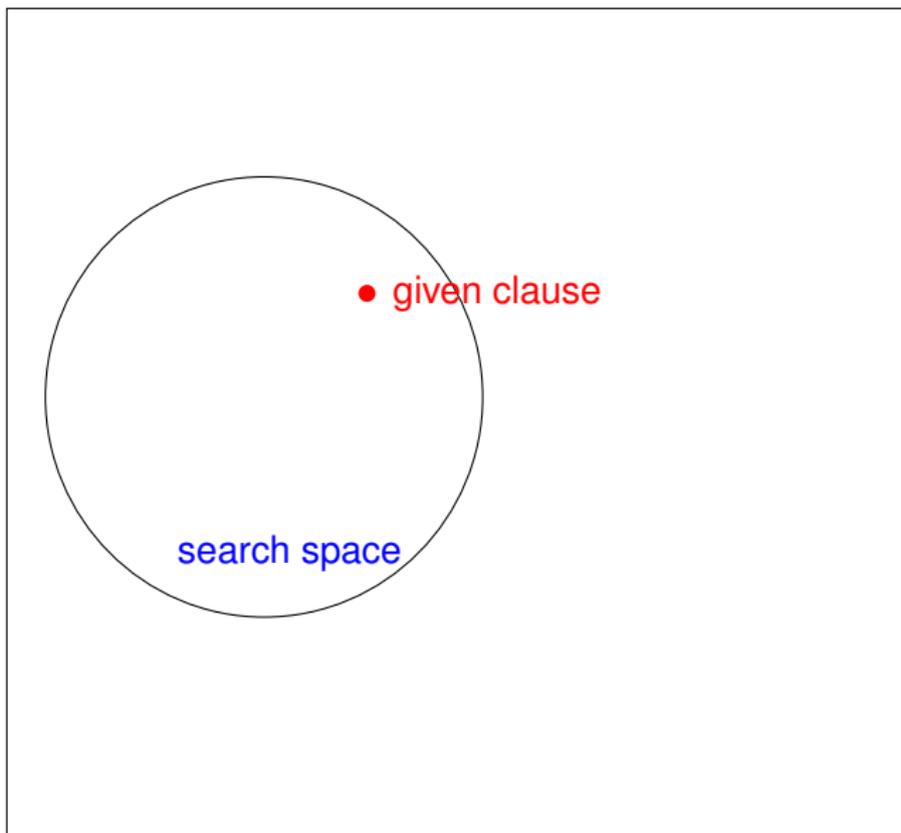
**Repeatedly apply inferences** to clauses in  $S$  and add their conclusions to  $S$ , unless these conclusions are already in  $S$ .

- ▶ If, at any stage, we obtain *false*, we terminate and **report unsatisfiability** of  $S_0$ .

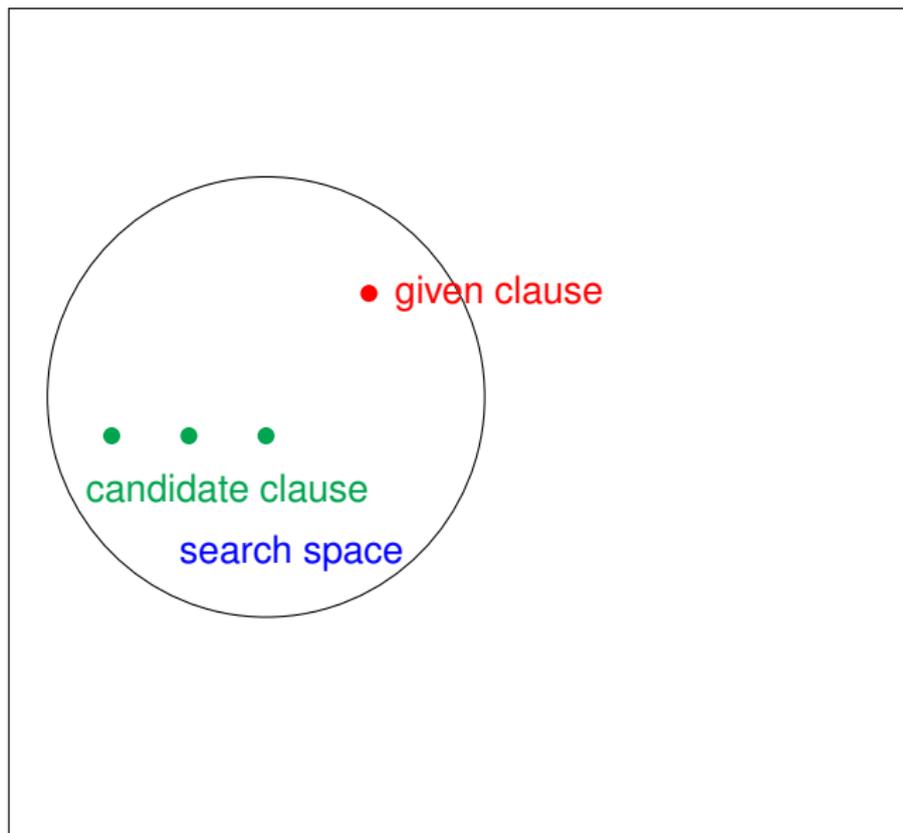
# Saturation Algorithms



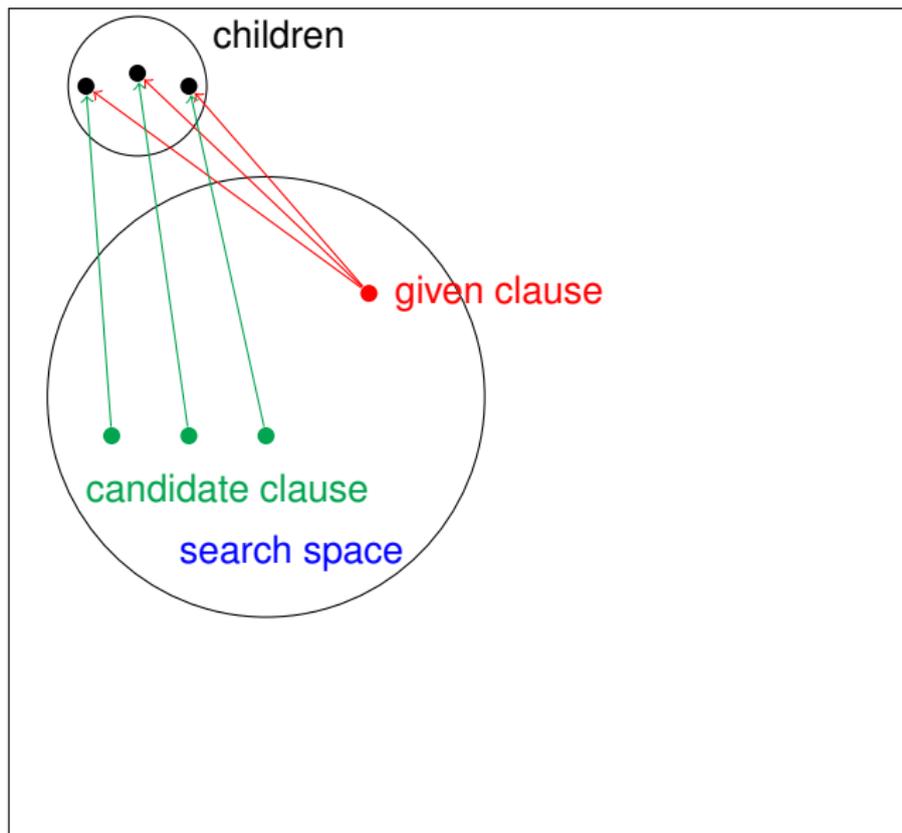
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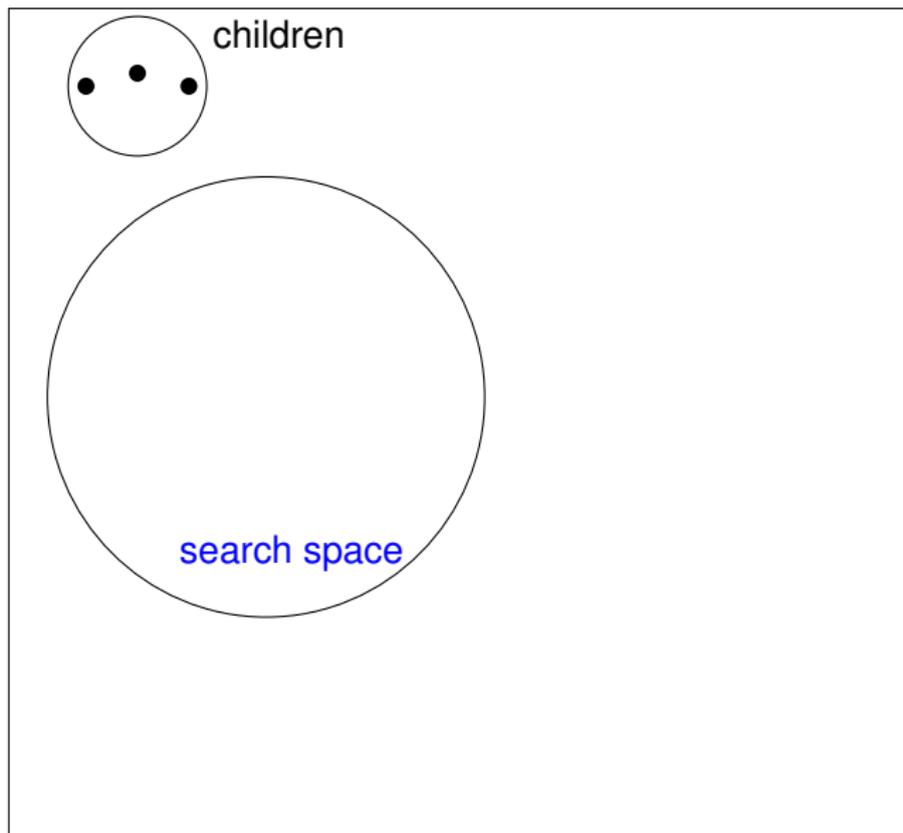
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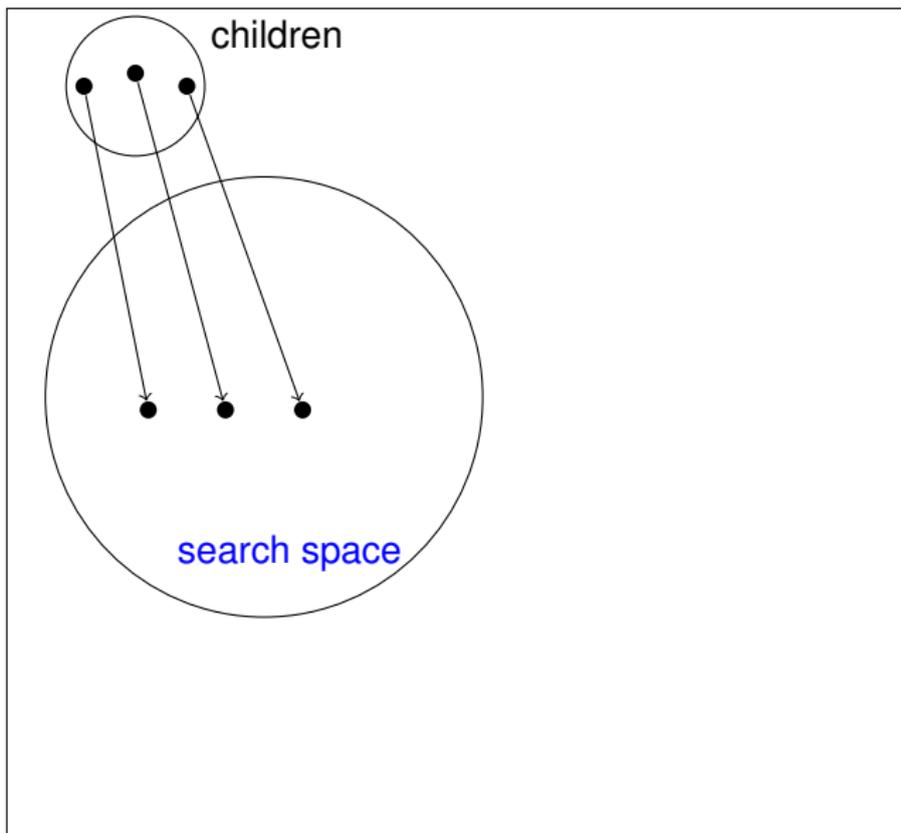
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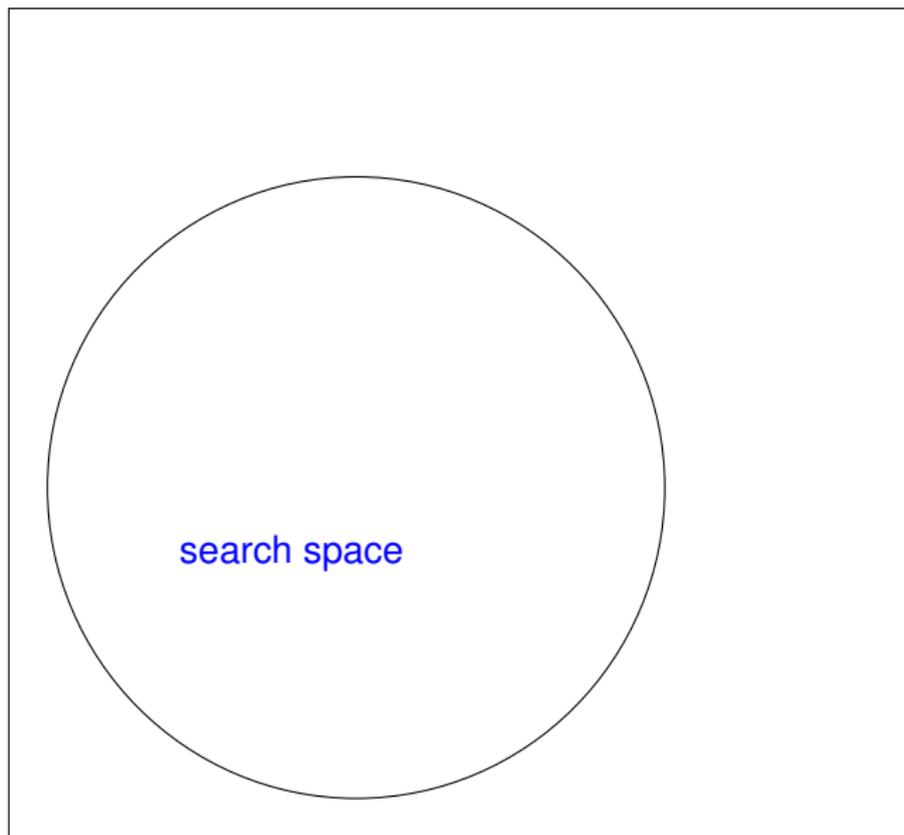
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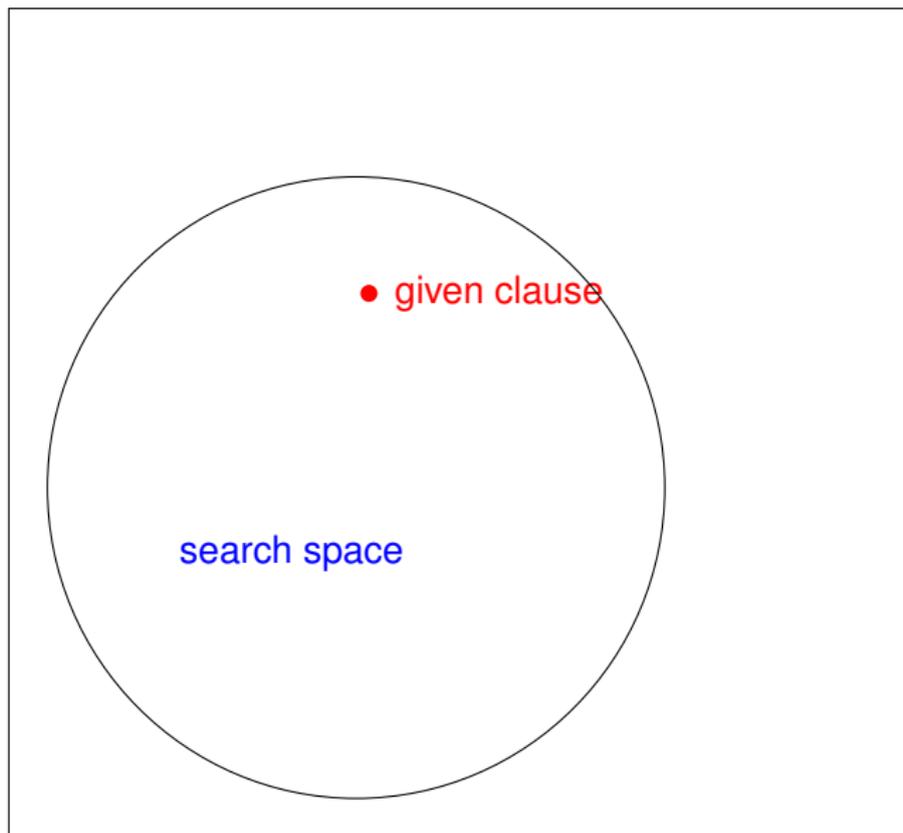
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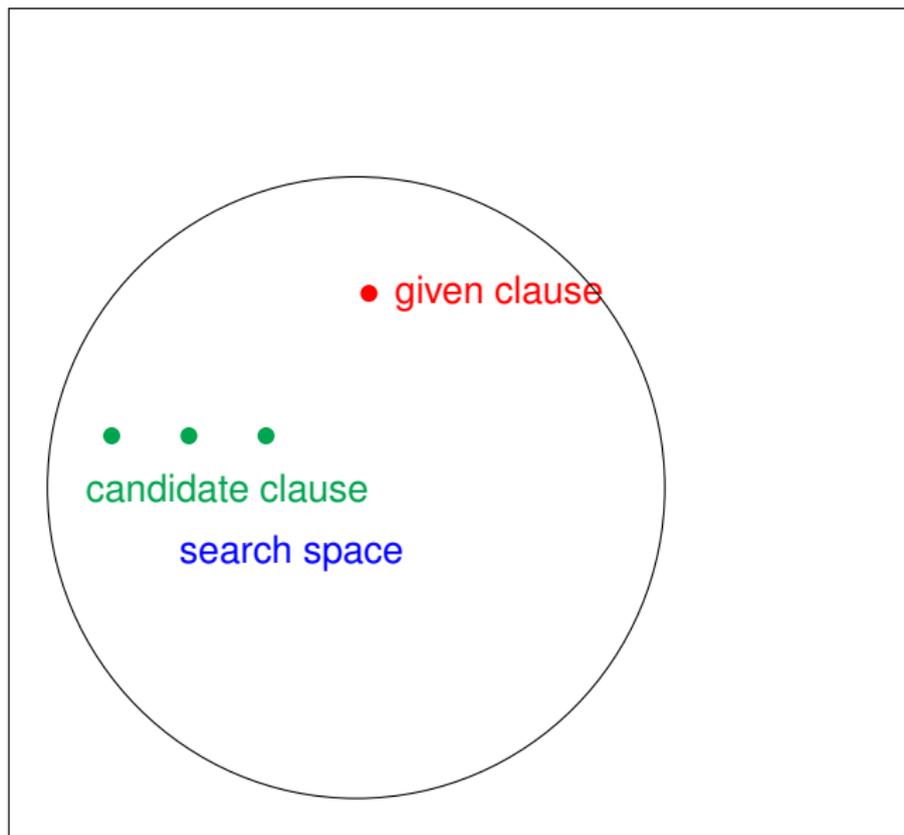
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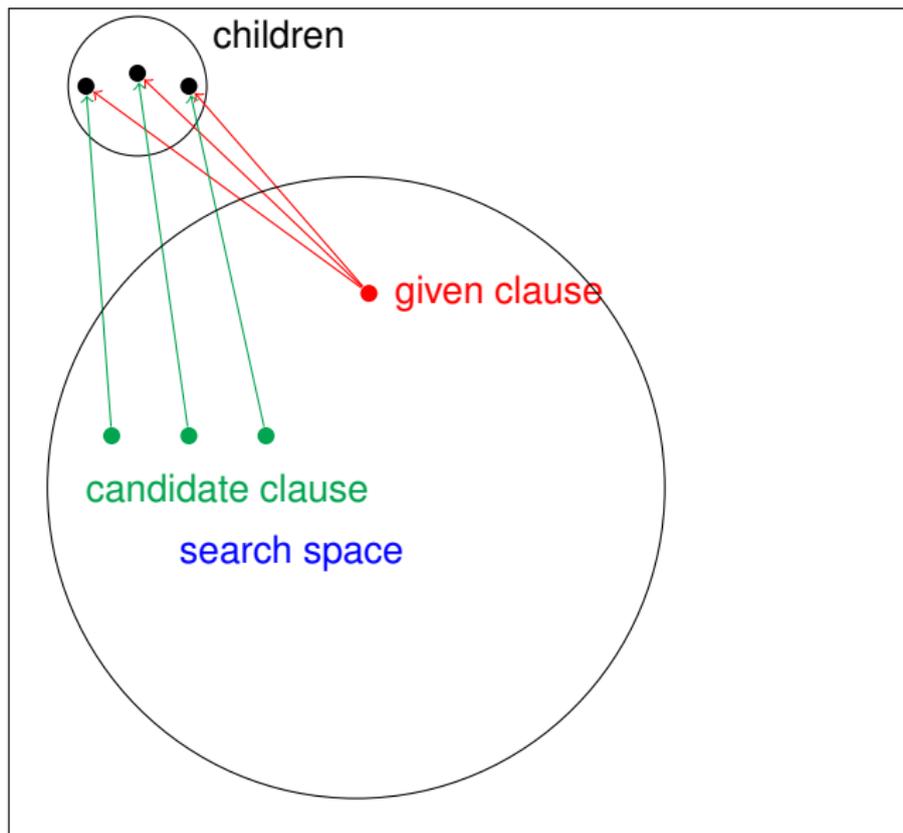
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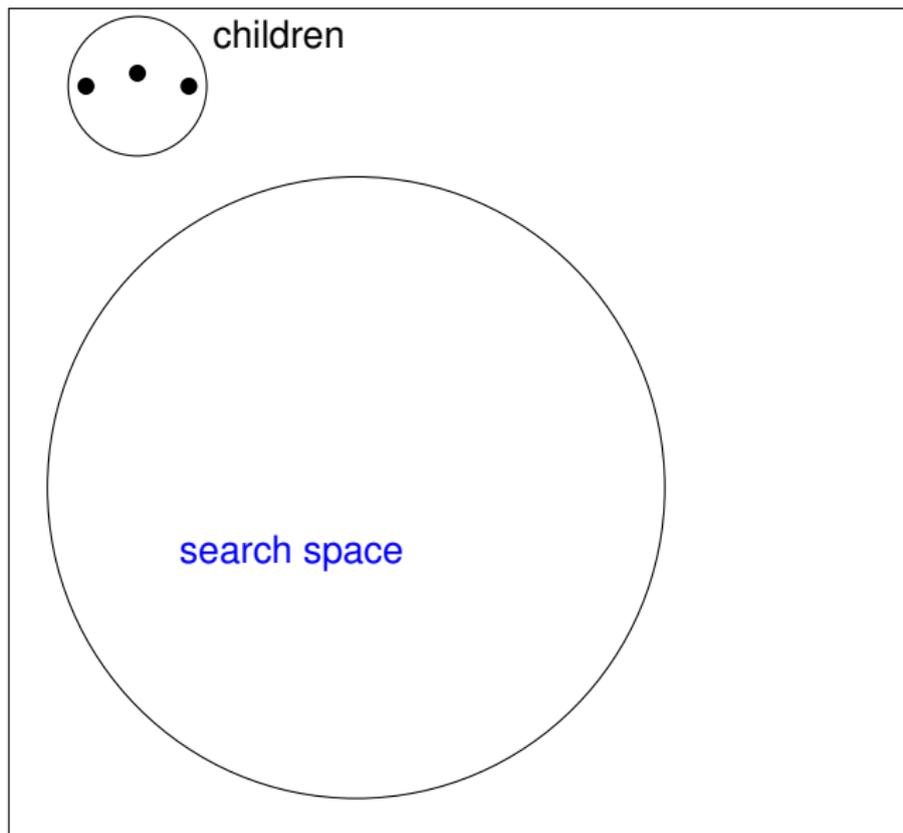
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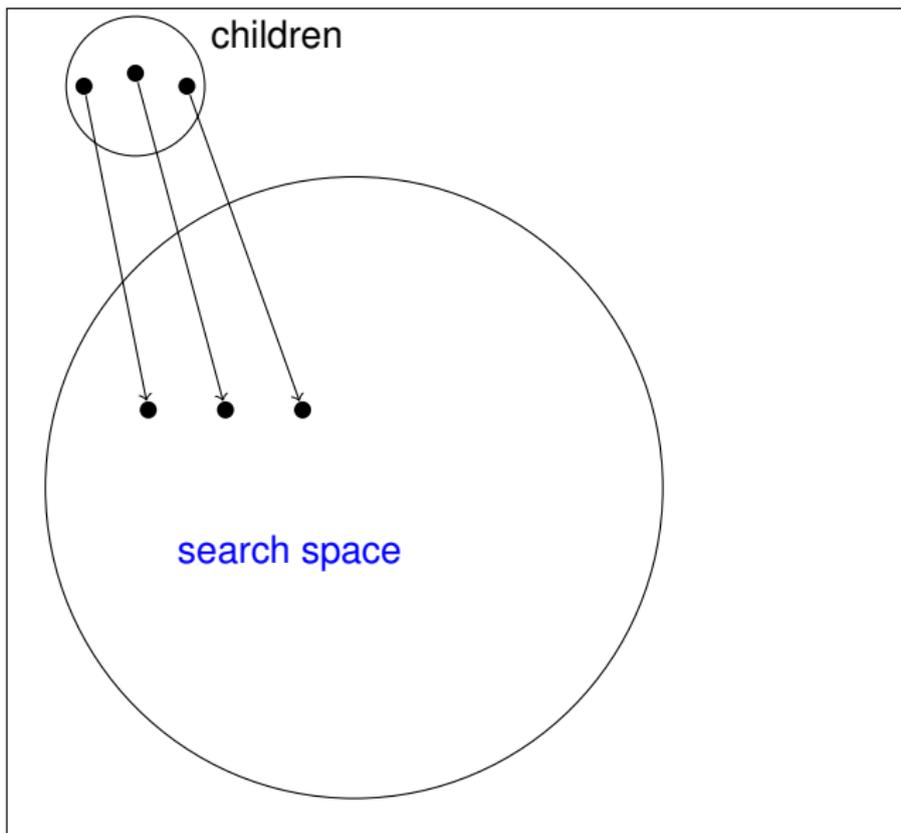
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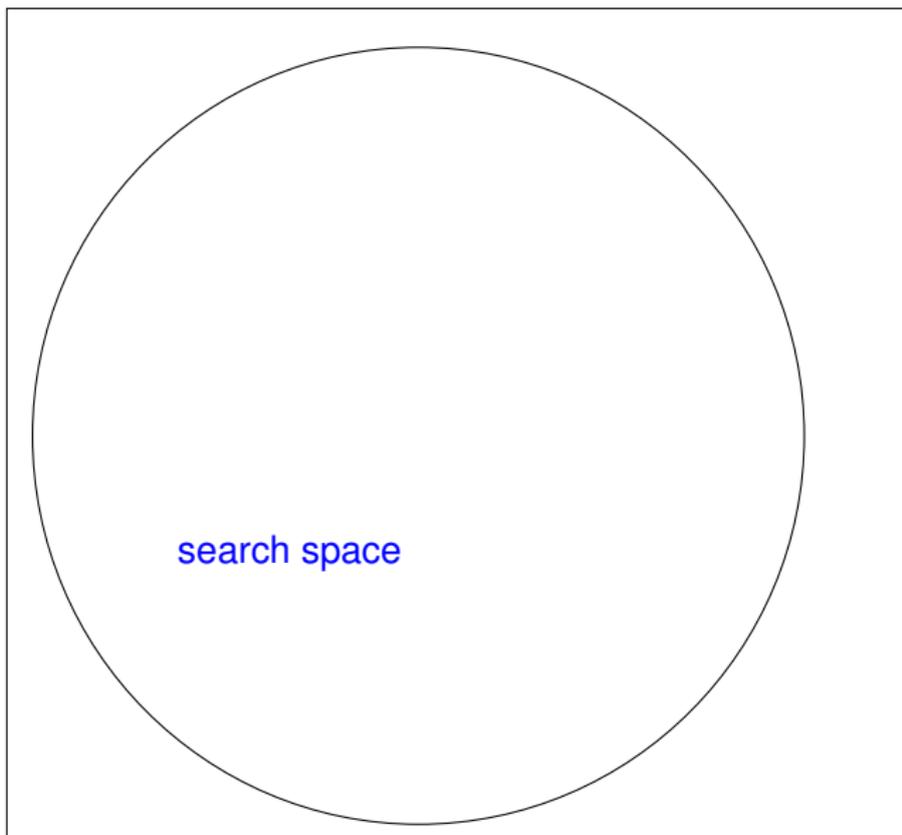
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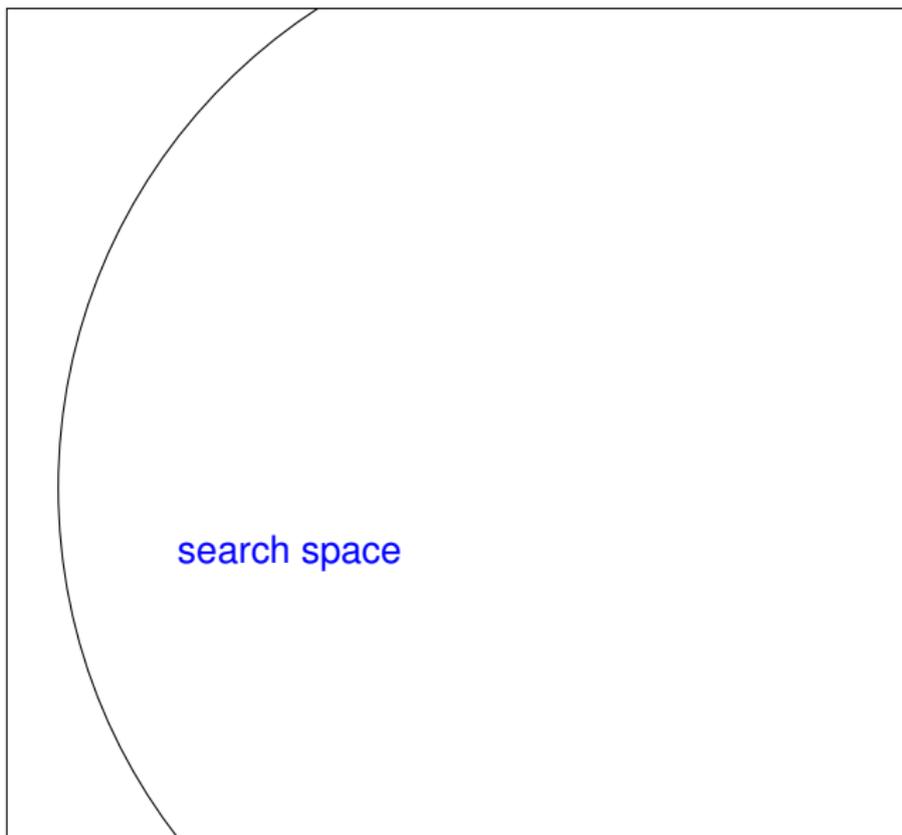
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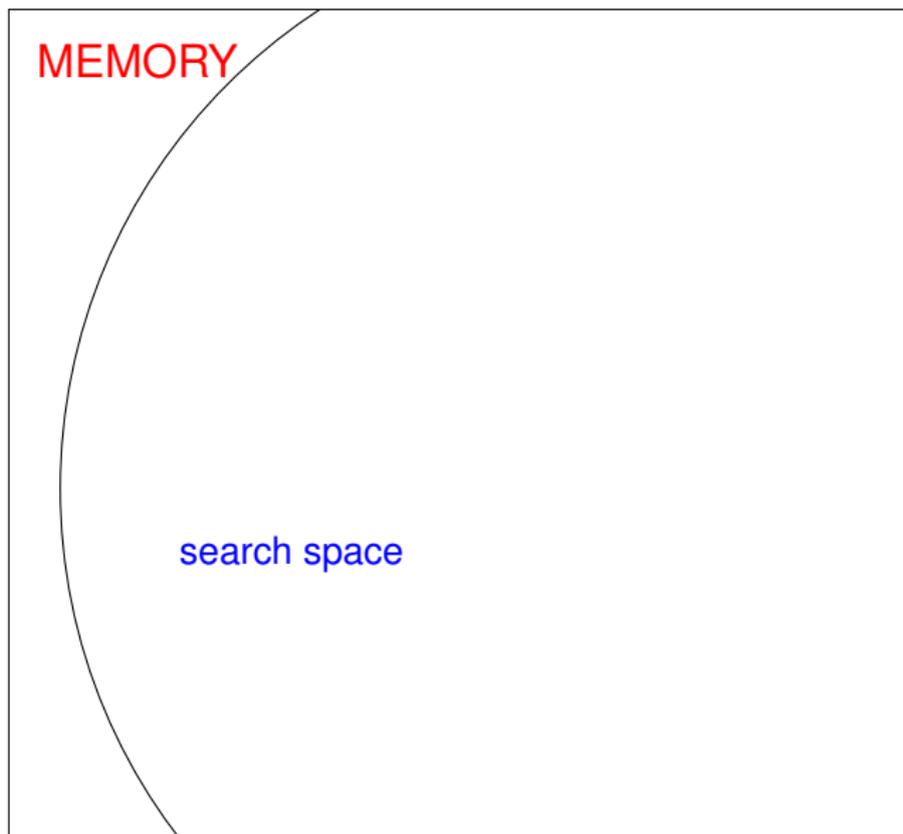
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# Saturation Algorithms



# Saturation Algorithm in Practice

In practice there are three possible scenarios:

1. At some moment *false* is generated, in this case the input set of clauses is unsatisfiable.
2. Saturation will terminate without ever generating *false*, in this case the input set of clauses is satisfiable.
3. Saturation will run until we run out of resources, but without generating *false*. In this case it is unknown whether the input set is unsatisfiable.

# From Theory to Practice

In practice, saturation theorem provers implement:

- ▶ Preprocessing and CNF transformation;
- ▶ Superposition system;
- ▶ Orderings and selection functions;
- ▶ Fairness (saturation algorithms);
- ▶ Deletion and generation of clauses in the search space;
- ▶ Many, many proof options and strategies

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Try:

```
vampire --age_weight_ratio 10:1
  --time_limit 86400
  GRP140-1.p
```

# Outline

Automated Theorem Proving - An Overview

Challenges of Automated Theorem Proving

# Automated Theorem Prover **was** Expected to Do

## Input:

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## Output:

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# What an Automated Theorem Prover **is** Expected to Do

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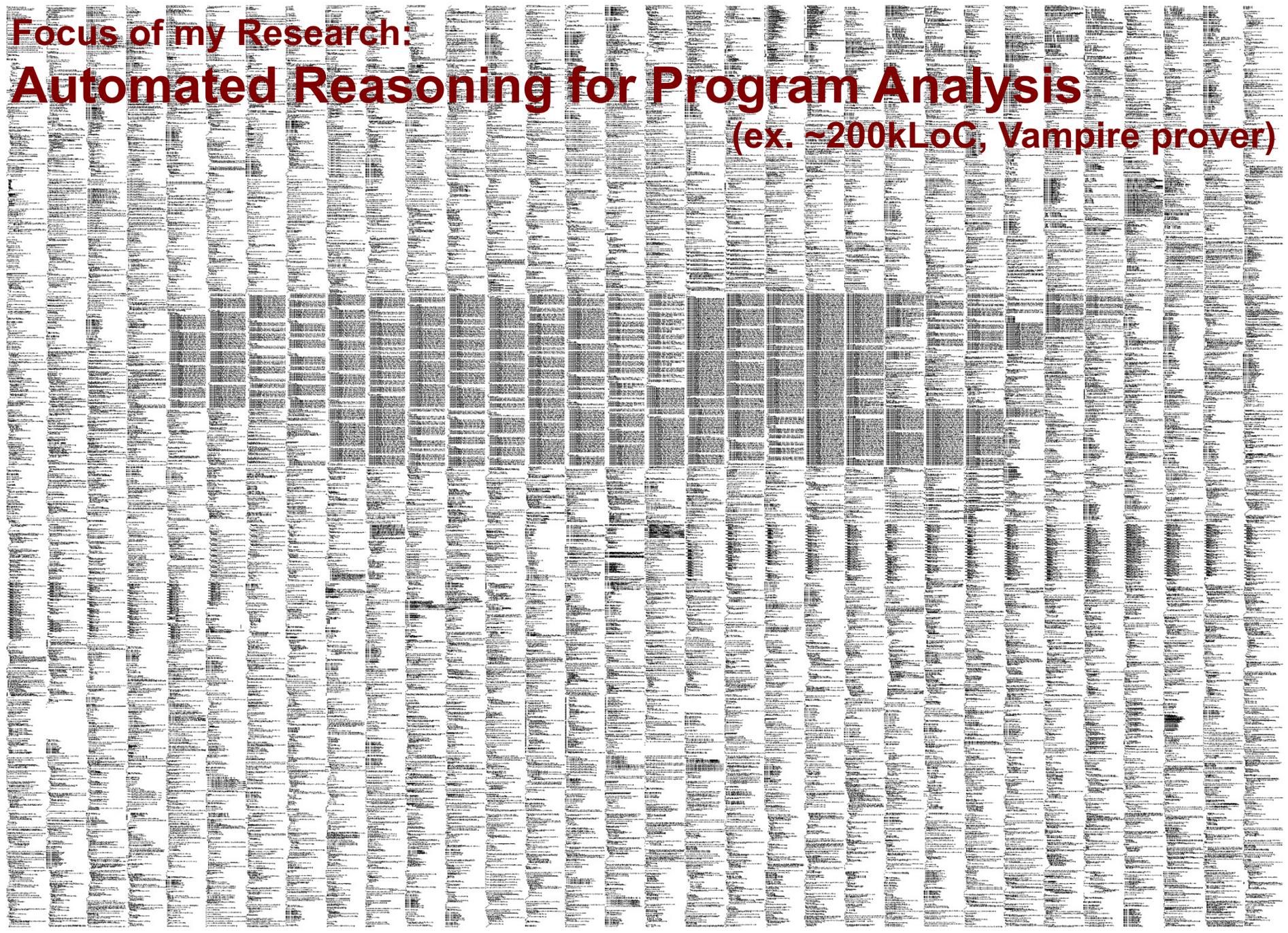
## Output:

- ▶ **readable proof**;
- ▶ **relevant lemmas** extracted from proofs;
- ▶ **Craig interpolants** extracted from software safety proofs;
- ▶ **program analysis**;
- ▶ **invariant generation**;
- ▶ **inductive reasoning**;
- ▶ Reasoning with **first-order theories of data structures**;
- ▶ ...

Focus of my Research:

# Automated Reasoning for Program Analysis

(ex. ~200kLoC, Vampire prover)



Focus of my Research:

# Automated Reasoning for Program Analysis

```
a=0, b=0, c=0;  
while (a<n) do  
  if A[a]>0 then B[b]=A[a]+h(b); b=b+1;  
    else C[c]=A[a]; c=c+1;  
  
  a=a+1;  
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Program property:

$(\forall p)(0 \leq p < b \Rightarrow$

$(\exists q)(0 \leq q < a \wedge B[p]=A[q]+h(p) \wedge A[q]>0)$

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h

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Logic

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Math

Logic

My Research



Program Analysis

Symbolic  
Computation

Automated  
Theorem Proving

My Research

funded by:



*Knut and Alice  
Wallenberg  
Foundation*



Program Analysis