#### Aesop: White-Box Automation for Lean 4

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Search Algorithm

**Registering Rules** 

**Built-In Rules** 

Debugging

**Miscellaneous Features** 

Applications, Shortcomings and Work In Progress

# Search Algorithm

A *rule* is an arbitrary Lean tactic.

Aesop provides convenient syntax (*rule builders*) for creating rules from theorems.

Aesop always operates with a user-defined *rule set*.

$$\vdash A \to C \to A \land (B \lor C)$$













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- Integer penalty
- Treated as 100% success probability
- 🐱 Good for performance
- Users need to make sure that the rule really is safe

#### Examples

#### Safe rule: <a>^-</a> introduction

 $\begin{array}{c}
 \Gamma \vdash A \land B \\
 \swarrow \\
 \Gamma \vdash A \quad \Gamma \vdash B
 \end{array}$ 

#### Unsafe rule: left v-introduction

 $\Gamma \vdash A \lor B$  $\downarrow$  $\Gamma \vdash A$ 

#### When Is A Rule Safe?

A rule *R* is *logically safe* if it preserves provability:

For each goal G, if G is provable and R, applied to G, generates subgoals  $G_1, \ldots, G_n$ , then  $G_1, \ldots, G_n$  must still be provable.

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A rule *R* is *relatively safe* if it preserves provability relative to a rule set *S*:

If a goal G is provable with rules from S and R, applied to G, generates subgoals  $G_1, \ldots, G_n$ , then  $G_1, \ldots, G_n$  must still be provable with rules from S.

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- Run in a fixpoint loop, i.e. until no normalisation rule succeeds any more
- 🐱 Can establish invariants for other rules
- 😐 Typically run multiple times on every goal

Example

#### ∧-elimination

 $\Gamma, h : A \land B \vdash T$  $\Gamma, h_1 : A, h_2 : B \vdash T$ 

#### Summary: Aesop's Search Algorithm



# **Registering Rules**

# Registering Rules Globally

@[aesop unsafe 100%] theorem And.intro : A  $\rightarrow$  B  $\rightarrow$  A  $\wedge$  B

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#### Safe rules

```
@[aesop safe 10]
theorem And.intro : A \rightarrow B \rightarrow A \wedge B
```

A rule builder turns a declaration into an Aesop rule.

In the examples so far, we have implicitly used a default builder.

Aesop currently provides 7 rule builders.
# **Apply Builder**

@[aesop safe apply 10] theorem And.intro :  $A \rightarrow B \rightarrow A \land B$ 

# **Apply Builder**

```
@[aesop safe apply 10] theorem And.intro : A \rightarrow B \rightarrow A \wedge B
```

Builds a rule that runs apply And.intro.

## **Constructors Builder**

```
@[aesop 50% constructors]
inductive Or (A B : Prop) where
| left : A \rightarrow Or A B
| right : B \rightarrow Or A B
```

Equivalent to one apply rule for each constructor.

## **Cases Builder**

```
@[aesop safe cases]
inductive Or (A B : Prop) where
  | left : A → Or A B
  | right : B → Or A B
```

Builds a rule that runs cases on any hypothesis of type Or A B.

# Forward Builder

```
@[aesop safe forward]
theorem pos_of_min_pos : ∀ {x y : ℕ},
0 < min x y →
0 < x ∧ 0 < y</pre>
```

$$\Gamma, x y : \mathbb{N}, h : 0 < \min x y \vdash T$$
  
$$\Gamma, x y : \mathbb{N}, h : 0 < \min x y, \frac{h}{1} : 0 < x \land 0 < y \vdash T$$

## **Destruct Builder**

```
@[aesop safe destruct]
theorem pos_of_min_pos : ∀ {x y : ℕ},
0 < min x y →
0 < x ∧ 0 < y</pre>
```

```
\Gamma, x y : \mathbb{N}, h : 0 < \min x y \vdash T\Gamma, x y : \mathbb{N}, h : 0 < x \land 0 < y \vdash T
```

Aesop runs simp\_all as a built-in normalisation rule with penalty 0.

This simp\_all call uses the default simp set plus an Aesop-specific simp set.

The simp builder adds an equation or proposition to this Aesop-specific set.

## **Tactic Builder**

aesop (add safe (by norm\_num; done))

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add\_aesop\_rules safe (by norm\_num; done)

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#### Requirement

If the tactic does not change the goal, it should fail.

# **Built-In Rules**



## Λ-introduction (safe, penalty 101)



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 $\begin{array}{c}
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 \Gamma \vdash A \quad \Gamma \vdash B
 \end{array}$ 

#### Λ-elimination (norm, penalty 0)

 $\Gamma, h : A \land B \vdash T$  $\Gamma, h_1 : A, h_2 : B \vdash T$ 



#### Λ-introduction (safe, penalty 101)

 $\begin{array}{c}
 \Gamma \vdash A \land B \\
 \swarrow \\
 \Gamma \vdash A \quad \Gamma \vdash B
 \end{array}$ 

#### Λ-elimination (norm, penalty 0)

 $\Gamma, h : A \land B \vdash T$  $\Gamma, h_1 : A, h_2 : B \vdash T$ 

Similar for Prod, PProd, MProd

Logic: v

## v-introduction (unsafe, success probability 50%)

$\Gamma \vdash A \lor B$	$\Gamma \vdash A \lor B$
$\Gamma \vdash A$	$\Gamma \vdash B$

Logic: v

## v-introduction (unsafe, success probability 50%)

$\Gamma \vdash A \lor B$	$\Gamma \vdash A \lor B$
	I
$\Gamma \vdash A$	$\Gamma \vdash B$

## v-elimination (safe, penalty 100)



Logic: v

## v-introduction (unsafe, success probability 50%)

$\Gamma \vdash A \lor B$	$\Gamma \vdash A \lor B$
l l	
$\Gamma \vdash A$	$\Gamma \vdash B$

## v-elimination (safe, penalty 100)

$$\Gamma, h : A \lor B \vdash T$$

$$\Gamma, h : A \vdash T \qquad \Gamma, h : B \vdash T$$

Similar for Sum, PSum

## Logic: $\forall$ and $\rightarrow$

## $\forall$ -introduction (norm, penalty -100) Run the intros tactic

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## ∀-introduction (norm, penalty -100) Run the intros tactic

∀-elimination (unsafe, success probability 75%)

$$\Gamma, h: \forall (x_1:A_1) \dots (x_n:A_n), B \vdash B$$
  
$$\Gamma, h \vdash A_1 \qquad \cdots \qquad \Gamma, h \vdash A_n$$

# Logic: 3

## ∃-introduction (unsafe, success probability 30%)

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## 3-elimination (norm, penalty 0)

$$\Gamma, h : \exists x : A, P x \vdash T$$
  
$$\Gamma, x : A, h : P x \vdash T$$

# Logic: 3

## ∃-introduction (unsafe, success probability 30%)

## 3-elimination (norm, penalty 0)

 $\Gamma, h : \exists x : A, P x \vdash T$  $\Gamma, x : A, h : P x \vdash T$ 

Similar for Subtype, Sigma, PSigma



#### $\leftrightarrow$ -introduction (safe, penalty 100)



Logic:  $\leftrightarrow$ 

#### $\leftrightarrow$ -introduction (safe, penalty 100)



#### $\leftrightarrow$ hypotheses

A hypothesis of type  $A \leftrightarrow B$  is treated as the equation A = B by the simplifier and the substitution rule.



# $\top$ -introduction<sup>1</sup> (safe, penalty 0)

```
Г⊢Т
|
✓
```



# $\top$ -introduction<sup>1</sup> (safe, penalty 0)

```
Γ⊢⊤
∣
✔
```

#### Similar for Unit, PUnit.

 $^{1}T = True$ 



# The simplifier already solves goals with an assumption $h: \perp$ .<sup>2</sup>

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We add destruct rules to conclude  $\bot$  from Empty and PEmpty.

Logic: ¬

## $\neg$ -introduction

 $\Gamma \vdash \neg A$  $\downarrow$  $\Gamma, h : A \vdash \bot$ 

Logic: ¬

#### ¬-introduction

 $\Gamma \vdash \neg A$  $\downarrow$  $\Gamma, h : A \vdash \bot$ 

### Negated hypotheses

Given a hypothesis of type  $\neg A$ , the simplifier replaces A with  $\bot$  everywhere in the goal.

The simplifier performs limited logical reasoning. If A and B are propositions:

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- $(T \land T) = T$
- $(\top \rightarrow A) = A$
# Logic: Simplifier

The simplifier performs limited logical reasoning. If A and B are propositions:

- With assumption h : A: rewrite  $A = \top$
- With assumption  $h : \neg A$ : rewrite  $A = \bot$
- $(\top \land \bot) = \bot$
- $(T \land T) = T$
- $(\top \to A) = A$
- etc.

In practice, these rules solve most 'purely logical' goals.

However, they are incomplete for first-order and even propositional logic.

# Equality

## Simplifier (norm, penalty 0)

Run the simp\_all tactic as described previously

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Run the simp\_all tactic as described previously

# Reflexivity (safe, penalty 0)

Run the rfl tactic

## Substitution (norm, penalty -50)

Run the subst tactic on any hypothesis of type x = tor t = x where x is a variable. This substitutes t for x everywhere in the goal and removes the now-redundant hypothesis.

# **Case Splitting**

# Split target (safe, penalty 100) Runs the split tactic. This tactic looks for if-then-else and match expressions in the target and performs case splits on their discriminees.

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## Split hypotheses (safe, penalty 1000) Ditto, but we look for case splits in hypotheses.

# Extensionality

### Extensionality (unsafe, success probability 80%) Run the ext tactic. This exhaustively applies extensionality lemmas to an equational goal. E.g.:

$$\Gamma, pq : A \times B \vdash p = q$$
$$\Gamma, pq : A \times B \vdash p.1 = q.1 \land p.2 = q.2$$

# Debugging

When Aesop fails to solve a goal, it reports the goals that remain after safe rules have been exhaustively applied.

This helps to check whether the safe rules do what you think they should.

## **Proof Generation**

```
theorem last_cons {a : α} {l : List α} (h : l ≠ nil) :
    last (a :: l) (cons_ne_nil a l) = last l h := by
    aesop? (add 1% cases List)
```

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```

aesop? generates a proof script:

```
intro h
cases l with
| nil =>
    simp_all only [last, ne_eq]
    split
| cons head tail => simp_all only [last]
```

One click replaces aesop? with the generated proof.

# Tracing

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- For other trace options see autocompletion for trace.aesop.

# **Miscellaneous Features**

## **Custom Rule Sets**

-- RuleSet.lean

-- Must be in a different file for technical reasons declare\_aesop\_rule\_sets [Foo]

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@[aesop 100% (rule\_sets [Foo])]
theorem foo

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```

Used for domain-specific automation, e.g. continuity, measurability, ...

## Metavariables

Aesop supports rules that generate metavariables:

```
example {a b c d : Nat} (h1 : a < b)
    (h2 : a < c) (h3 : c < d) : a < d := by
    apply Nat.lt_trans
    -- + a < ?x
    -- + ?x < d

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```

- Aesop's search algorithm should be complete even in the presence of metavariables
- • This is very expensive

# Applications, Shortcomings and Work In Progress

General-purpose automation

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- Tree search backend for LLMs: Peiyang Song, Kaiyu Yang, and Anima Anandkumar. "Towards Large Language Models as Copilots for Theorem Proving in Lean". In: Workshop on Mathematical Reasoning and AI. 2023. URL: https://mathai2023.github.io/papers/4.pdf

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- Repeated calls to simp during normalisation are bad for performance
- Nontrivial sets of forward rules are very slow (WIP)