# Prover9 Unleashed: Automated Configuration for Enhanced Proof Discovery

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#### **Outline**

Automated Theorem Proving and Prover9

Grackle Strategy Invention

Experiments on AIM Problems

Experiments on TPTP Problems

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#### **Prover9: Legendary Theorem Prover**

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- Prover9 is an automated theorem prover for first-order logic
- ... based on resolution and paramodulation.
- Not developed since 2009 but . . .
- ... still actively and successfully used by its users.
- ... still used in the CASC competition (as a reference).

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   ... does not have an automated strategy selection mechanism.
- Goal: Use Grackle automated strategy invention on Prover9.
- Question: Can Prover9 still compete with state-of-the-art?

## **Prover9: Proof Search Strategy Configuration**

Supports more than 100 basic options
 ... (booleans, numerical, categorical).

```
set(binary_resolution).
set(expand_relational_defs).
clear(back_subsume).
assign(order, kbo).
assign(not_weight, -2).
assign(or_weight, 200).
assign(prop_atom_weight, 9999).
```

#### **Prover9: Given Clause Selection Configuration**

- Prover9 processes one given clause a time.
- Allows to define which clauses should be preferred,
   ... using priority queues where clauses are sorted (age/weight)

```
list(given_selection).
  part(queue1, high, age , weight < 500 & -horn ) = 50.
  part(queue2, high, weight, depth < 15 ) = 50.
  part(queue3, low , weight, -false ) = 5.
  part(rest , low , random, all ) = 1.
end_of_list.</pre>
```

#### **Prover9: Action Rules**

• action rules: Change options values on the fly, ... when certain event occur.

```
list(actions).
  generated=5000 -> assign(pick_given_ratio, 4).
end_of_list.
```

## Prover9: Keep/Delete Rules

keep/delete rules: Delete generated clauses (incomplete),
 ... satisfying a delete condition unless kept is satisfied.

```
list(delete).
   weight > 20 & variables > 4.
   weight > 30.
end_of_list.

list(keep).
   horn & variables<3.
end_of_list.</pre>
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- During evolution, different grackle species developed different bill sizes to be able to feed on different types of nutrients.
- This decreases competition between different species and increases the chances of their survival.



## **Grackle: Algorithm Overview**

- Successor/generalization of BliStr/Tune tools.
- Grackle utilizes existing algorithm configuration frameworks
  - ParamILS: Iterative Local Search (Hutter et al.)
  - SMAC3: Bayesian Optimization (Lindauer et al.)

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- Grackle output:
  - · portfolio of strategies complementary on input problems

## **Grackle: Invent Portfolio of Strategies**

#### Repeat the following:

- 1. Evaluate all strategies on all problems P
- 2. Select one strategy S to be improved
- 3. Specialize strategy S for the problems where it performs best
- 4. Go to 1

#### Terminate when:

- all strategies has been improved, or ...
- time limit is reached.

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- 6. H<sup>ratio</sup>: the queue selection ratio

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This gives rise to 2 Grackle domains:

- default domain: only basic options (value-based)
- full domain: basic + advanced features

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AIM benchmark used in the CASC 2016 ATP competition
 ... divided into 1020 training and 200 testing problems
 ... from a large theorem proving project in loop theory.

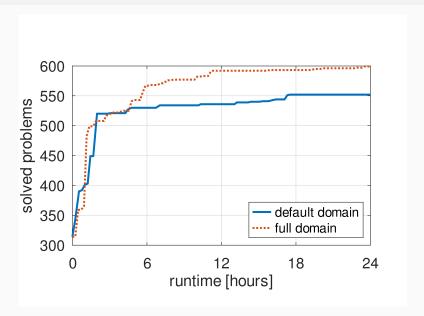
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- The 10 best strategies are evaluated on testing problems, ... each with a time limit of 30 seconds (30 \* 10 = 300).
- This portfolio is compared with E and Vampire's portfolios
   ... with a compatible time limit of 300 seconds.

## Grackle run on AIM train problems



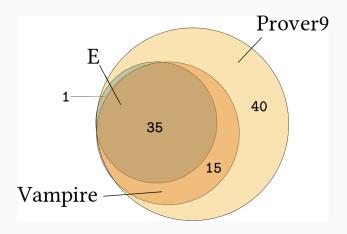
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## Results on 200 AIM testing problems



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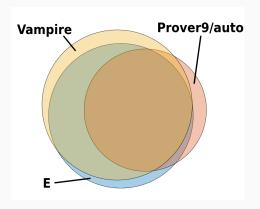
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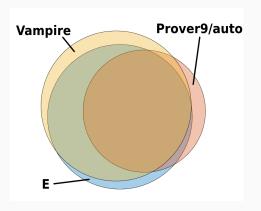
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• Q: On which TPTP category Prover9/auto performs best?



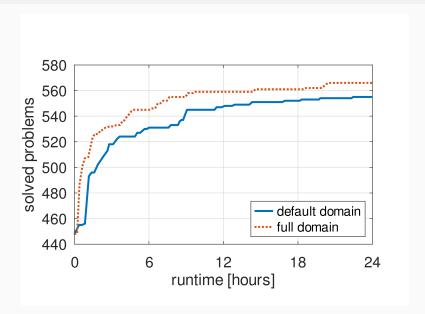
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• A: On TPTP/NUM category.

# Grackle run on TPTP/NUM problems



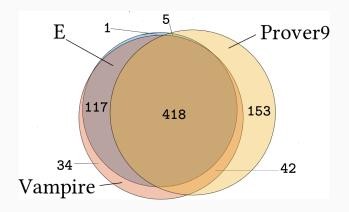
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## Results on TPTP/NUM problems



## Thank you for listening.

#### Future work:

- Run Grackle for Prover9 on other TPTP categories.
- Intelligent problem-based strategy selection.
- Grackle strategy invention with Prover9 hints.

Grackle is available at GitHub:

http://github.com/ai4reason/grackle

Questions?