

Boosting Automated Reasoning by Mining Existing Proofs

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25-30 years combined effort

200,000 lines of Isabelle code

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Problem:

Finding a suitable sequence of proof steps is hard!

Proof Automation

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- Much sought after property
 - Reduces Human Intervention
 - Benefits in many fields

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 - Expressivity vs Automation Tradeoff

Proof Libraries

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lemma "( $\exists x. \forall y. P x y$ )  $\longrightarrow$  ( $\forall y. \exists x. P x y$ )"  
  apply (rule impI)  
  apply (erule exE)  
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  apply assumption  
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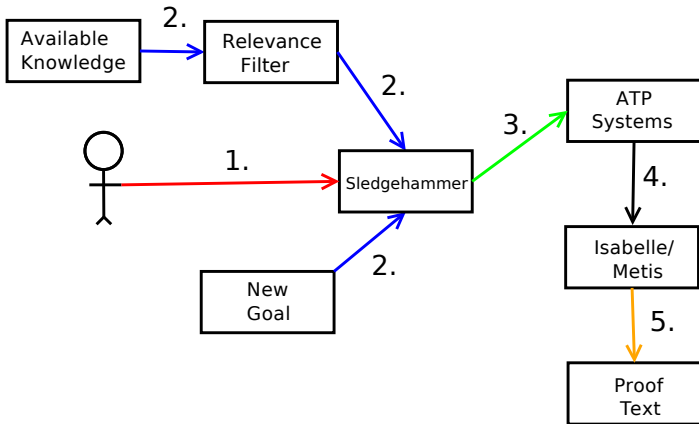
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Idea:

Can we use this information to automate new proofs?

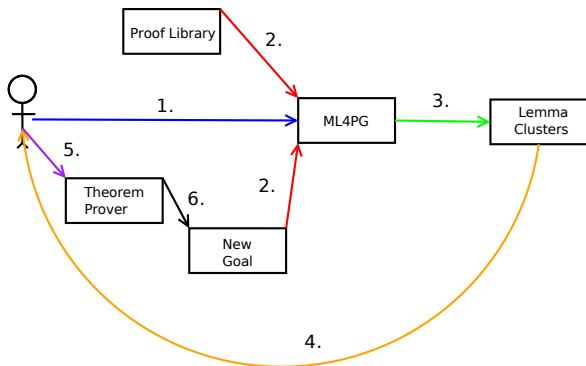
Increasing Automation in ITP's - Link ATP's and ITP's

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Increasing Automation in ITP's - Proof Hints

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Sequence 1:

rule impl

assumption

Sequence 2:

rule conjl

assumption

Tactic:

(rule impl OR rule conjl) THEN

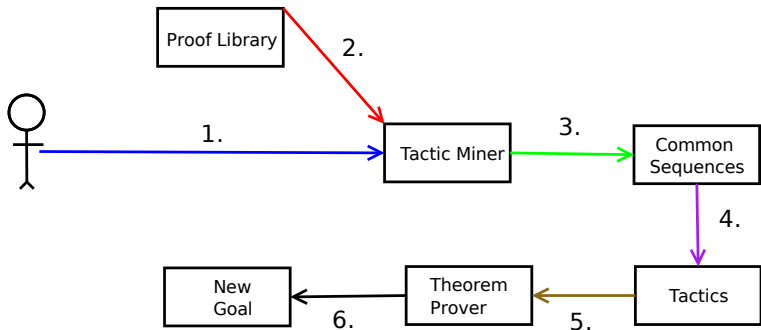
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Previous Tactic Mining Work

Carried out by Hazel Duncan at Edinburgh.

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Critique of Duncan's approach

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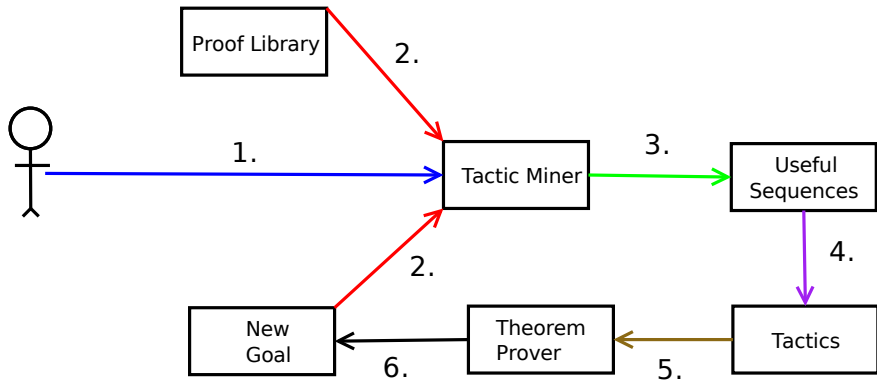
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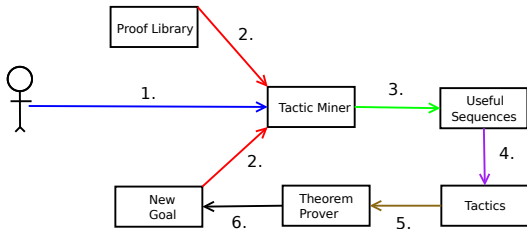
- Moderately effective on test set
- No subgoal information
- Inefficient tactic application

My Tactic Mining Approach



1. How can we deal with complex Higher Order Languages?

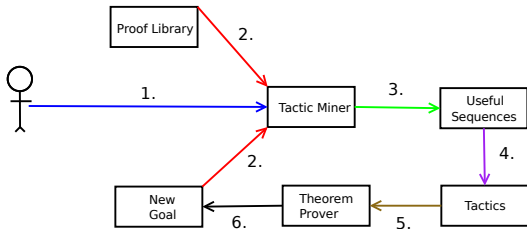
Variable instantiations and proof directives



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Variable instantiations and proof directives

One sequence of steps solves many proofs and vice versa

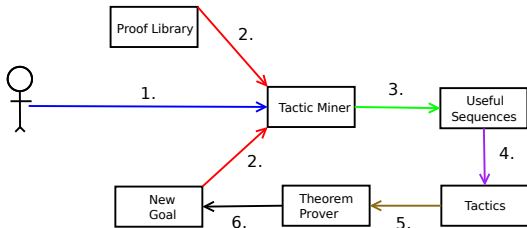


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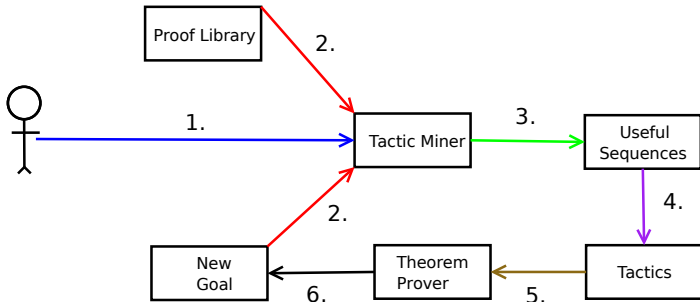
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Different proof styles



2. Which Data Mining Techniques can help?

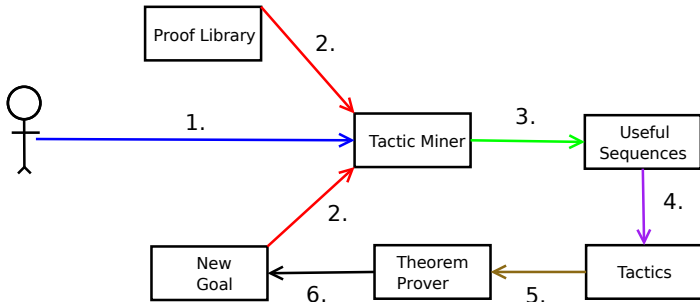
An open research question



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An open research question

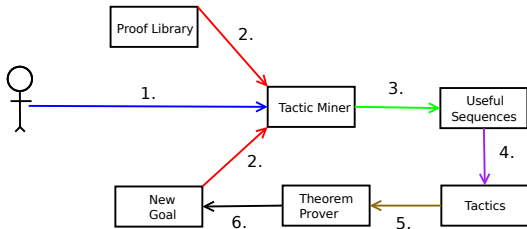
Two tasks: Finding the patterns and generalising into tactics



3. How will the theorem prover and tactic miner communicate?

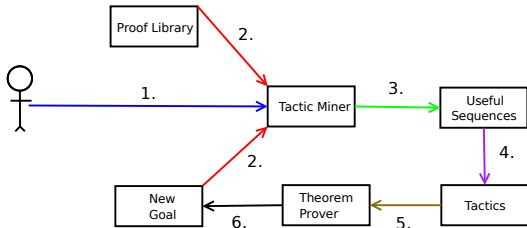
We require two methods of communication to be defined:

- Theorem Prover to Tactic Miner
- Tactic Miner to Theorem Prover



4. How can we make use of negative information?

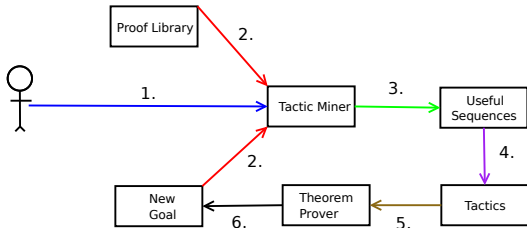
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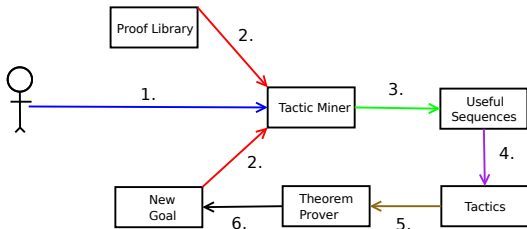
- User inputs



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Leverage negative information from:

- User inputs
- Failed traces from existing automated tools

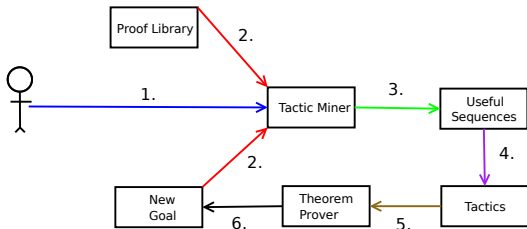


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Would enable a supervised learning approach.



Current Work

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I am currently at the following stage with my work:

- Data Extraction from Isabelle
- Considering learning techniques

Any Questions?

Please feel free to ask me any questions, either now or at any point during the workshop!