

An Implementation of  
**SAT-Based**  
**Two-Terminal Path Finding**  
Using Z3 Solver

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# Outlines

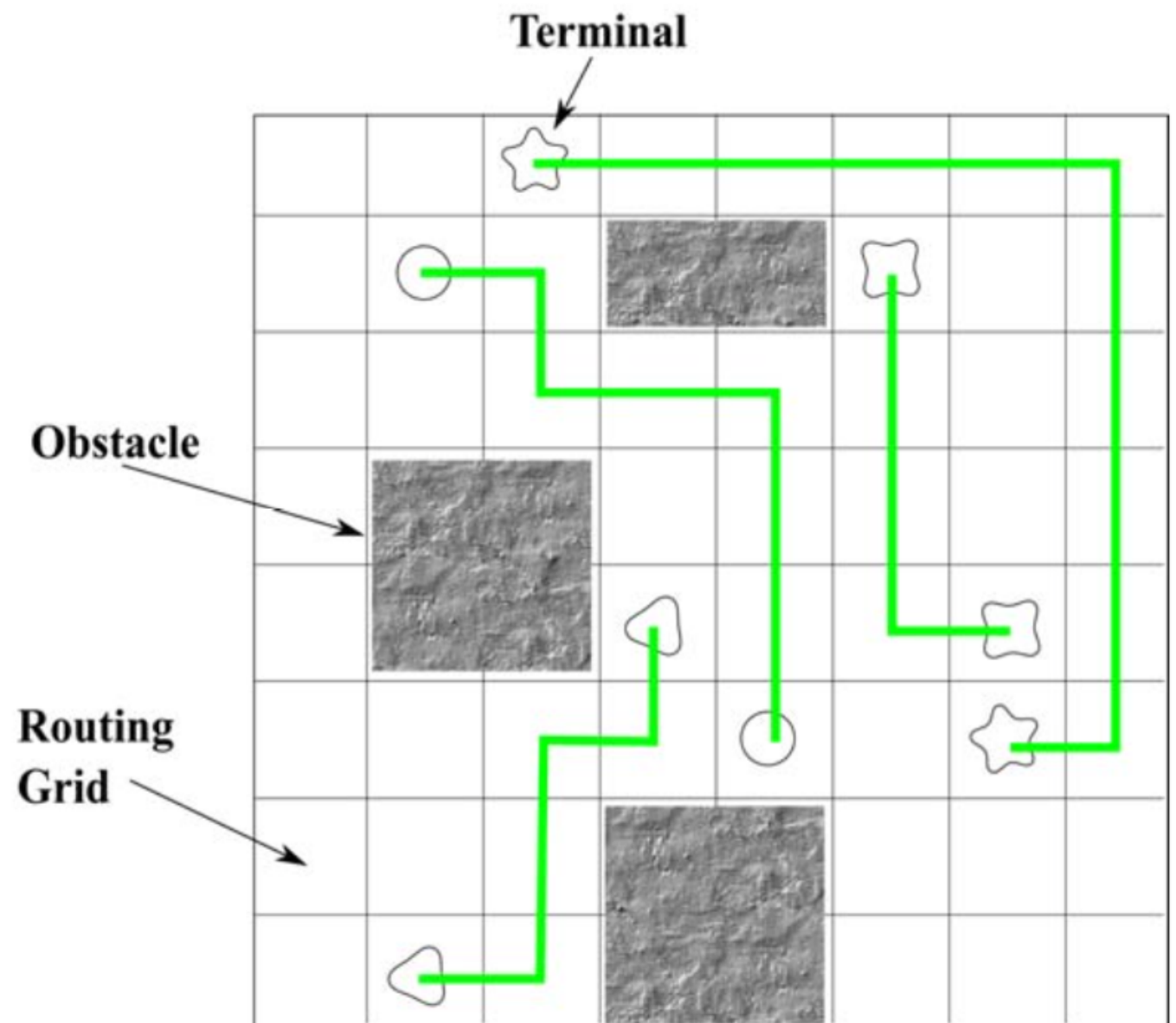
- Introduction
- Model
  - Flow based model
  - Point based model
- Optimization
- Evaluation and Results
- System Architecture
- Demo
- Acknowledgements

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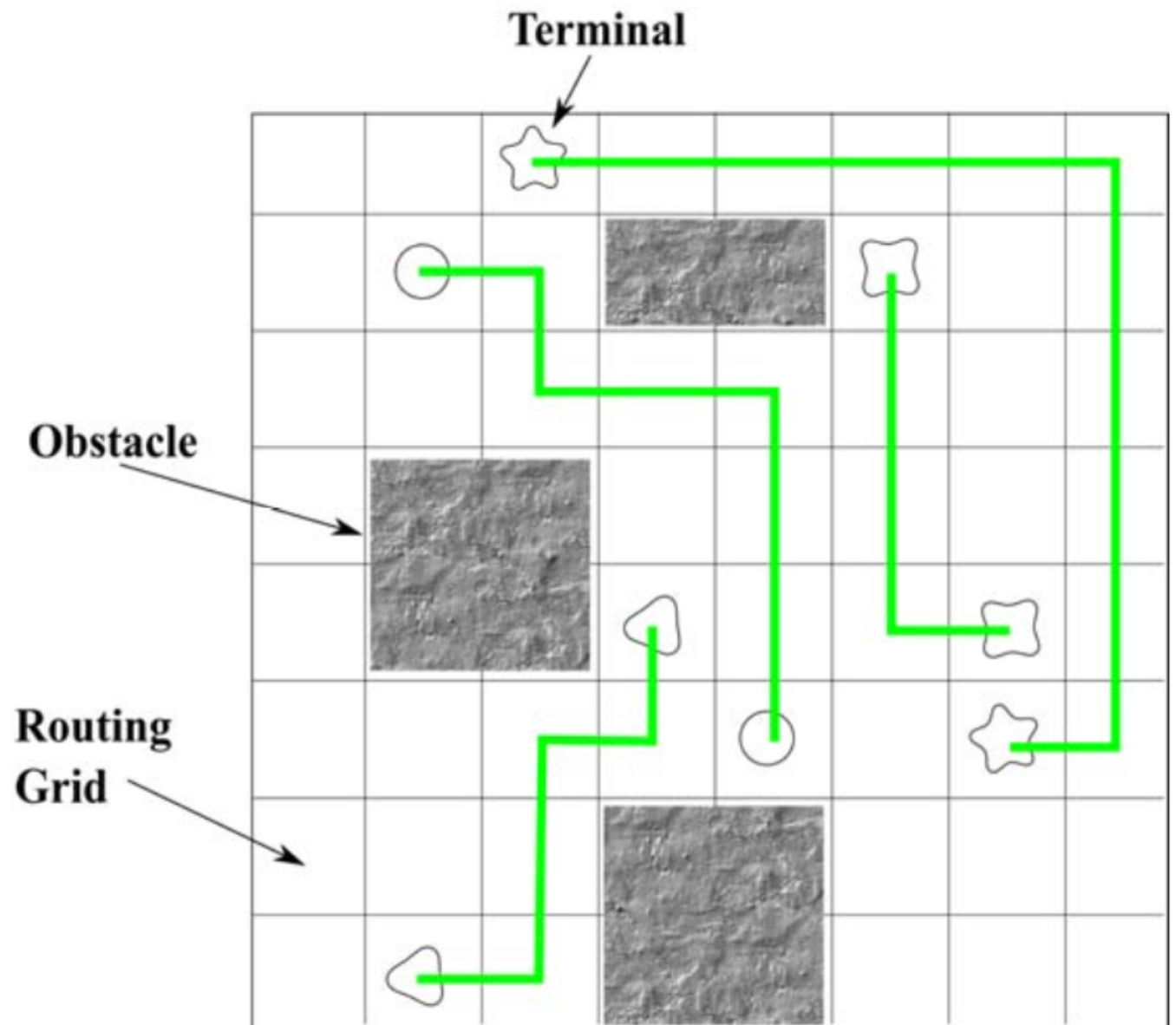
# Introduction

- **Problem**  
given  $N \times N$  routing grids,  
and  $M$  pairs of terminals  
use program to  
find routing paths  
connecting each pair  
of terminals.
- **Constraints**  
different paths cannot cross  
each other  
no path can cross obstacles



# Introduction

- **Object**  
maximize the number of connected pairs  
when all pairs of terminals can be connected, should minimize the total length of all the paths.
- **Stipulates**  
if one grid is defined to be one terminal of pair  $d$ , then other pairs  $d'$  can not route across the grid.



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# Flow Based Model

- For every droplet
  - establish a network flow model
  - edge: binary variable (SAT-Based model)
  - constraints: flow conservation
- Every grid can only be visited once
  - linear-like term
- $2 * N^2 * M$  variables,  $O(N^2 * M)$  constraints.
- Is equivalent to the original model

# Point Based Model

- $c_{p,d}$ : whether the droplet  $d$  visit across the position  $p$
- limit terms
  - barrier/not corresponding layer: FALSE
  - one grid be visited once:

$$\sum_{d=1}^M [c_{p,d}] \leq 1$$

- connection terms:

$$c_{p,d} \rightarrow \left( \sum_{p' \in B(p)} [c_{p',d}] = 2 \right) \quad (\text{free grid})$$

$$c_{p,d} \rightarrow \left( \sum_{p' \in B(p)} [c_{p',d}] = 1 \right) \quad (\text{terminal grid})$$

- source and terminal terms:

$$c_{p_d^*,d} \leftrightarrow c_{p_d^\dagger,d}$$

- objective:

$$\text{maximize } \sum_{d=1}^M [c_{p_d^*,d}] \quad \text{minimize } \sum_d \sum_p [c_{p,d}]$$



# Point Based Model

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**Is not equivalent to the original model**

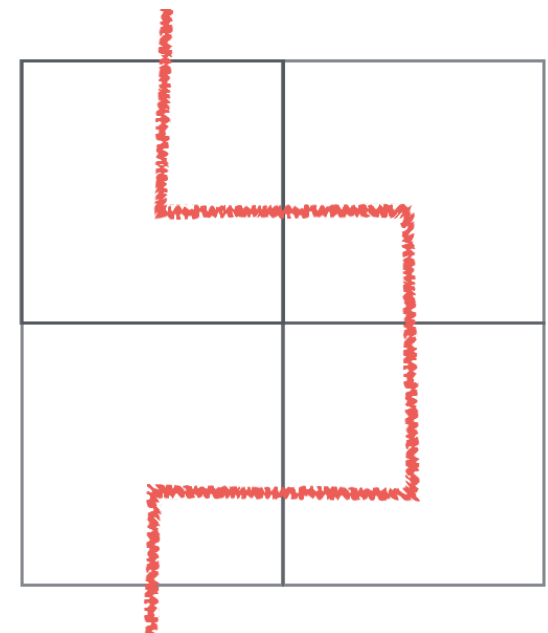
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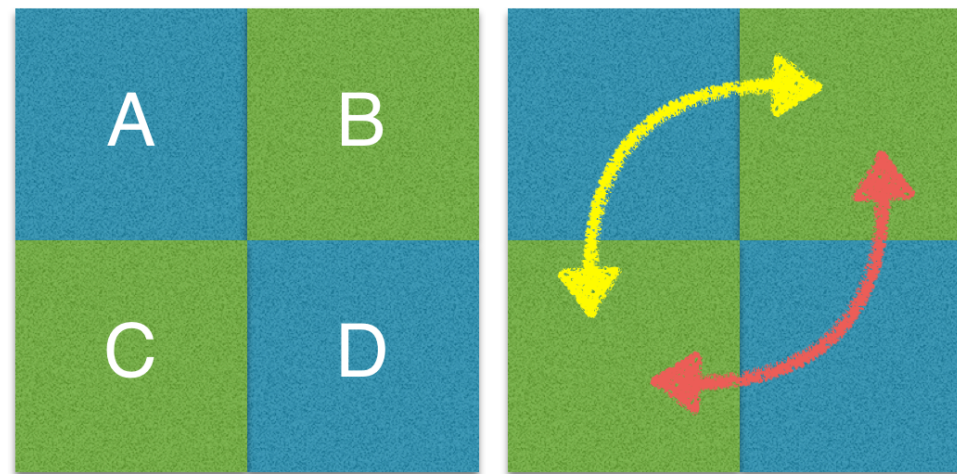
# Optimization

- Problem Confronted: Too slow
- Solution:
  - Combined Terms  
Combine several constraints together  
(in Z3 solver)
  - Prune Terms

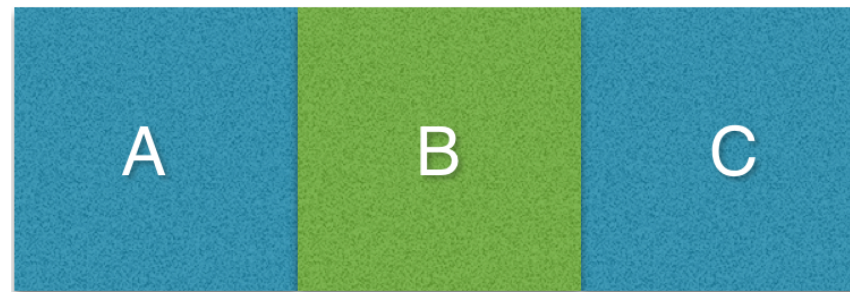


# Prune Terms

- Aim: told Z3 directly how shortest path like
- Prune Term 0:  $\neg(c_{p_1,d} \wedge c_{p_2,d} \wedge c_{p_3,d} \wedge c_{p_4,d})$



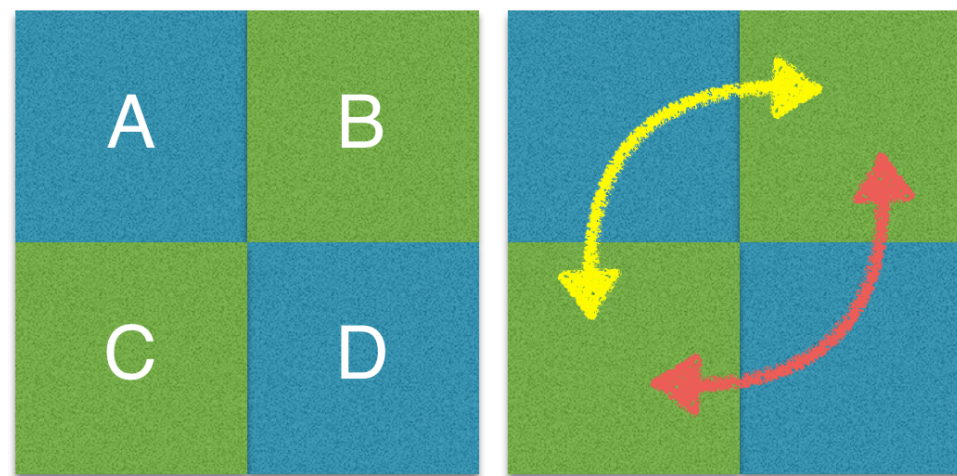
- Prune Term 1:  $(\sum_{x=1}^M [c_{p_1,x}] = 0) \rightarrow \neg(c_{p_2,d} \wedge c_{p_3,d} \wedge c_{p_4,d})$



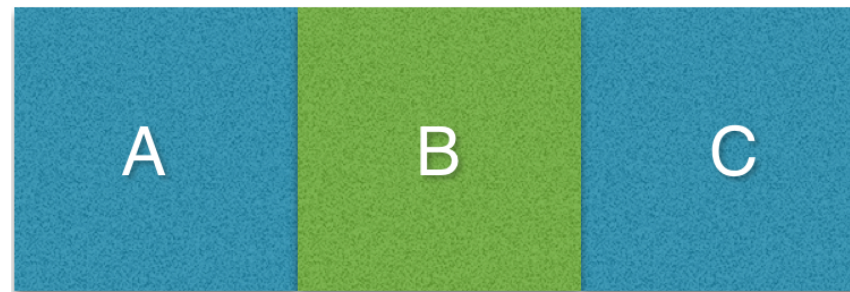
- Prune Term 2:  $(\sum_{x=1}^M [c_{p_1,x}] = 0) \rightarrow \neg(c_{p_2,d} \wedge c_{p_3,d})$

# Prune Terms

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- Prune Term 0:  $\neg(c_{p_1,d} \wedge c_{p_2,d} \wedge c_{p_3,d} \wedge c_{p_4,d})$



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# Evaluation & Results

- Correctness
  - legality check
  - pair-wise check (using 2 different models)
  - N in {6,7,8}, M in {1,..,9}, proportion of obstacles 10%
  - randomly generate 30 tests each batch
- Efficiency
  - proportion of obstacles 0%, M in {1..9}, N up to 12
  - randomly generate 100 tests each batch

N	flow	flow <sub>p</sub>	point <sub>p</sub>	point <sub>p</sub> <sup>†</sup>
6	0.07	....	....	...
7	0.09	....	....	...
8	120	0.43	0.13	0.12
9	....	1.70	0.40	0.35
10	....	8.24	1.44	1.18
11	....	49.6	4.80	4.47
12	....	349	36.0	27.3

Table 1. Mean Time

N	flow	flow <sub>p</sub>	point <sub>p</sub>	point <sub>p</sub> <sup>†</sup>
6	0.21(2)	....(.)	....(.)	....(.)
7	3.38(3)	....(.)	....(.)	....(.)
8	482(4)	0.81(4)	0.21(4)	0.18(4)
9	....(.)	4.02(4)	0.61(5)	0.56(4)
10	....(.)	18.4(4)	2.37(6)	1.88(7)
11	....(.)	159(5)	8.30(5)	7.46(6)
12	....(.)	1125(5)	70.6(6)	50.0(6)

Table 2. Max Mean Time[1]

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[1] unit: sec, the data format is X(Y), which X represent the total time(seconds) and Y in {1,...,9} means the value M which has the largest mean time.

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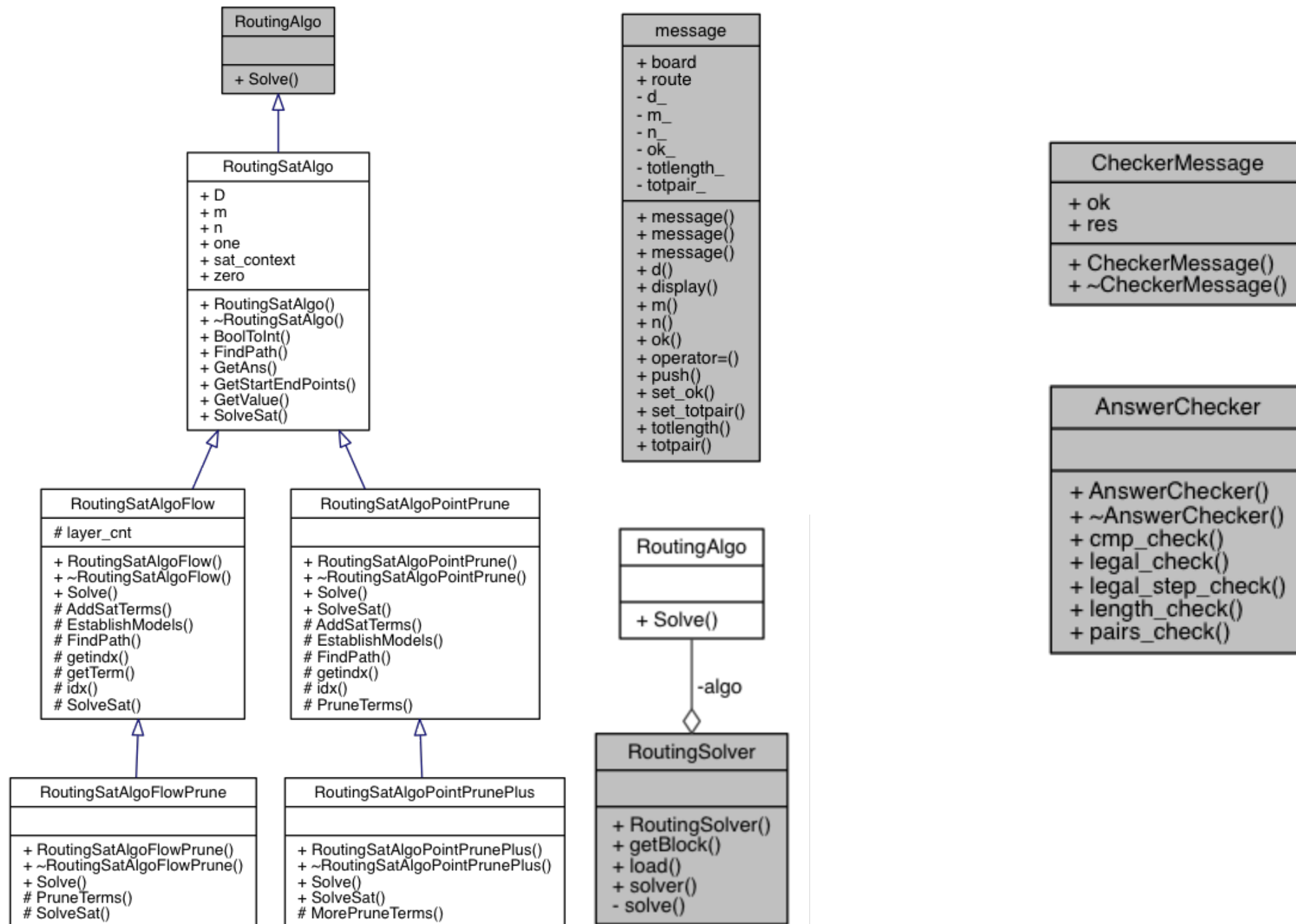
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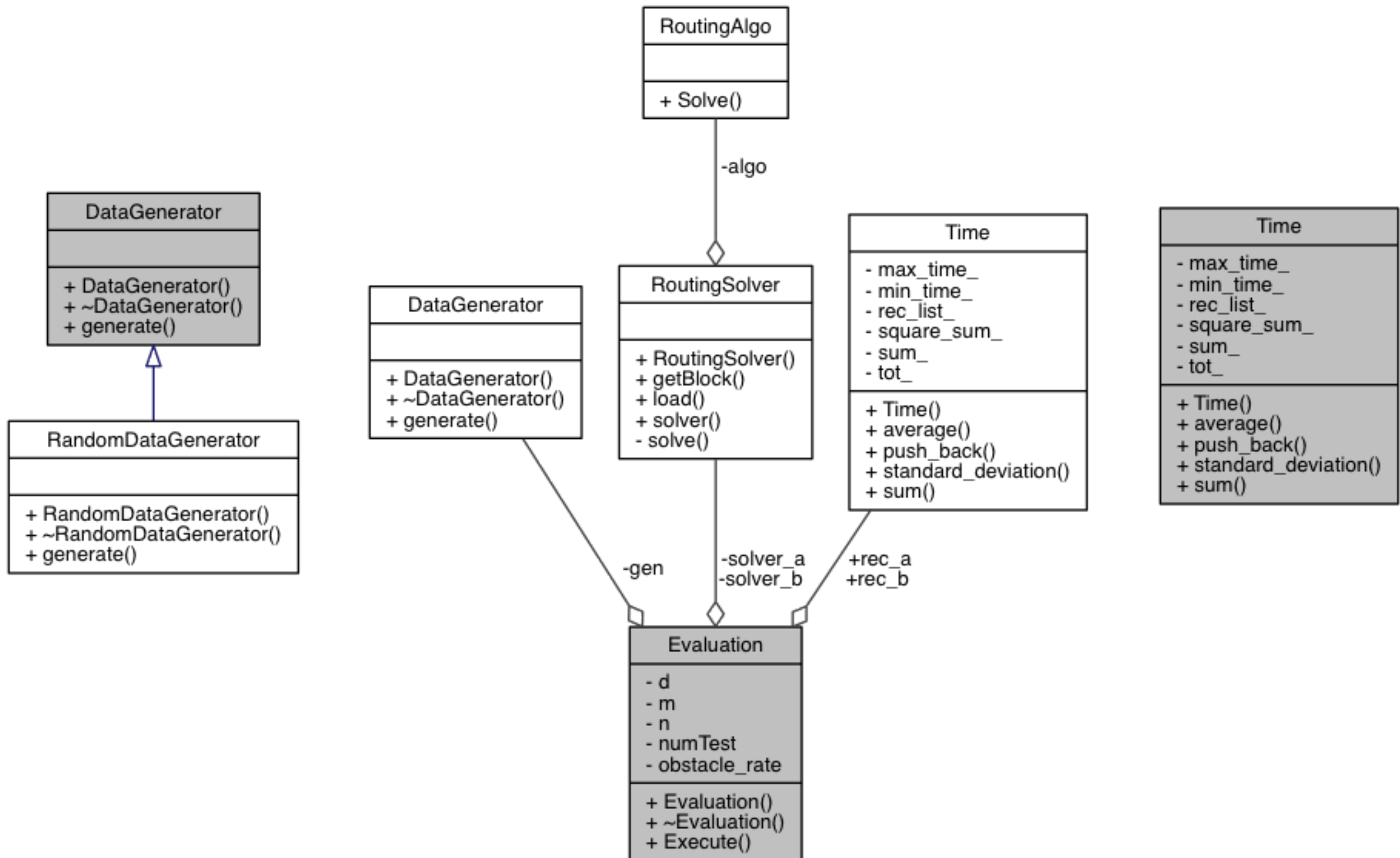
# System Architecture

- Four main parts
  - **core**: the whole algorithm.
  - **checker**: check if the answer calculated by the algorithm is legal and correct.
  - **evaluation**: evaluate the efficiency and correctness of the algorithm(including data generator).
  - **demo**.

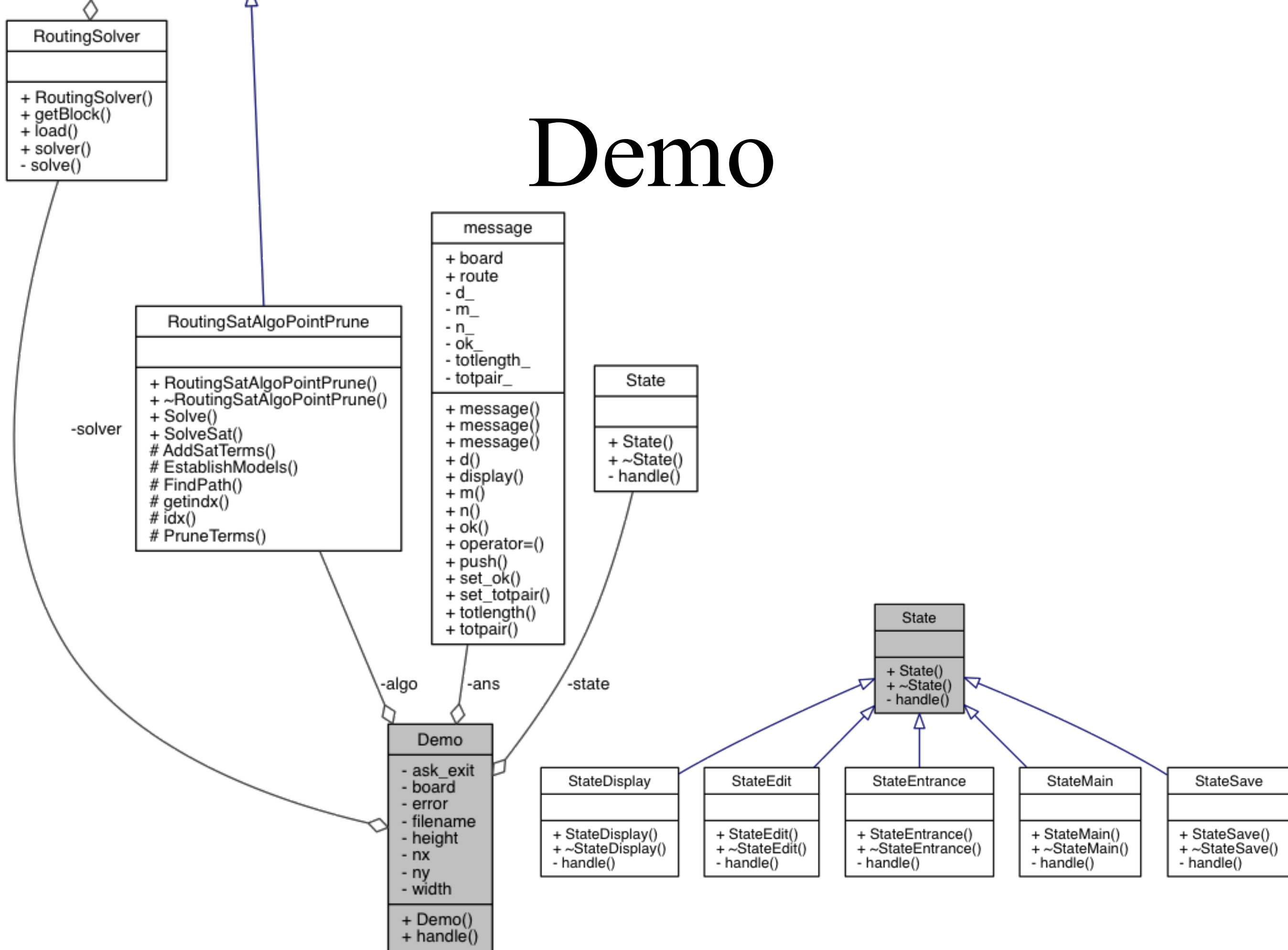
# Core & Checker



# Evaluation



# Demo



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Demo

# Acknowledgements

- Yue Yu
  - for the prune terms
- Zihan Xu
  - for the discussion on the implementation

Thank you  
Q&A<sub>[1]</sub>

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[1] More details can be seen in the whitepaper in [https://github.com/wmyw96/IndividualProject\\_OOP/blob/master/doc/whitepaper.pdf](https://github.com/wmyw96/IndividualProject_OOP/blob/master/doc/whitepaper.pdf)