

Under-Approximation Refinement for Timed Automata

Bachelor's Thesis

Kevin Grimm

Department of Mathematics and Computer Science
Artificial Intelligence



University
of Basel

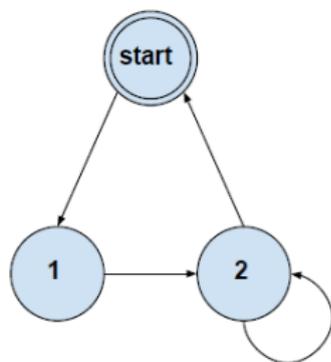
February 13, 2017

IDEA

Adapt the under-approximation refinement algorithm to find errors in **real-time systems**.

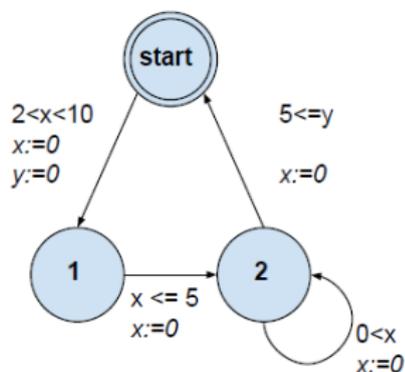
- Real-time systems can be modelled with **timed automata**.

EXAMPLE



- L : locations
- l_0 : initial location
- E : edges

EXAMPLE

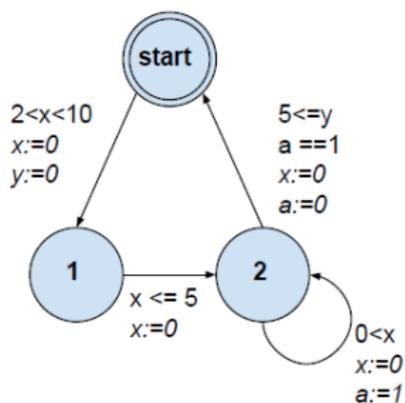


- L : locations
- l_0 : initial location
- E : edges

Additionally:

- C : clock variables

EXAMPLE



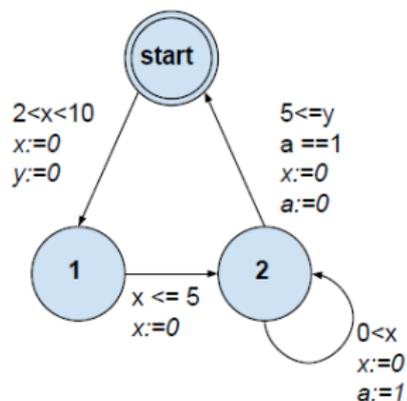
- L : locations
- l_0 : initial location
- E : edges

Additionally:

- C : clock variables
- V : integer variables

EXAMPLE

Problem: idling in locations



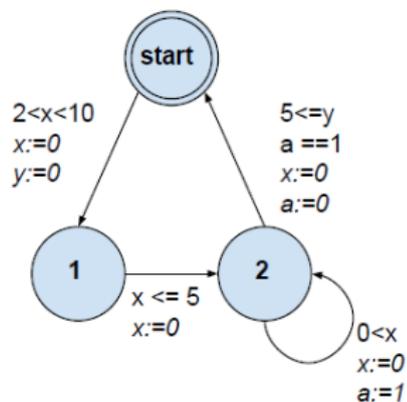
- L : locations
- l_0 : initial location
- E : edges

Additionally:

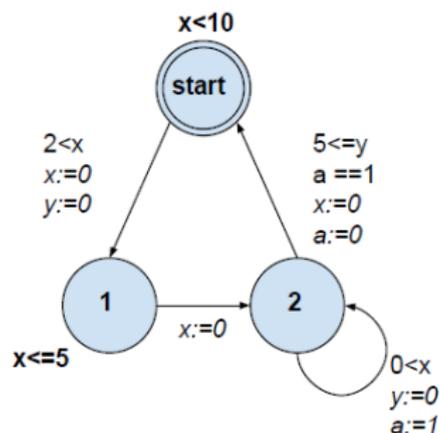
- C : clock variables
- V : integer variables

EXAMPLE

Problem: idling in locations

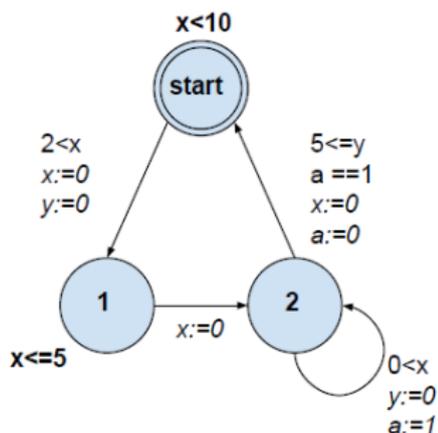


Solution: location invariants



EXAMPLE

6-tuple $\langle L, C, V, E, I, l_0 \rangle$



- L : locations
- l_0 : initial location
- E : edges

Additionally:

- C : clock variables
- V : integer variables
- I : assigns location invariants

IDEA

Adapt the under-approximation refinement algorithm to find **errors** in real-time systems.

- **State spaces** can be used to model the behaviour of timed automata.
- Errors are states with specific properties.

STATE SPACE

Given: $T = \langle L, C, V, E, I, l_0 \rangle$

States are triples $\langle l, v, u \rangle$, where:

- l : locations $\in L$
- v : integer valuation
- u : clock assignment

Two transition types:

- delay transition: $\langle l, v, u \rangle \xrightarrow{d} \langle l, v, u + d \rangle$
- action transition: $\langle l, v, u \rangle \xrightarrow{a} \langle l', v', u' \rangle$

Challenge: clocks are real valued

ZONE GRAPH

Challenge: clocks are real valued

Solution: zones

- zone: conjunction of clock constraints

Example: $z := (0 \leq x \leq 12 \wedge y == 0)$

- zone graph:

states are triples $\langle l, v, z \rangle$

zone transition: $\langle l, v, z \rangle \xrightarrow{a} \langle l', v', z' \rangle$

TRANSITIONS

- Zone transition: transition between states of zone graph
- Structural transition: transition induced by edges

CONCURRENT SYSTEMS

Challenge: building the product of timed automata is complex

Solution: running concurrent systems on the fly

- timed automaton is a 7-tuple $\langle L, \Sigma, C, V, E, I, l_0 \rangle$:
 - Σ contains synchronisation labels
- Labelled Edges:
 - Asynchronous transition: void label
 - Synchronous transition: synchronisation label
- States are triples $\langle l, v, z \rangle$ where l is a location valuation

IDEA

Adapt the under-approximation refinement algorithm to **find** errors in real-time systems.

Use **directed model checking** (similar to planning):

- heuristic function
- search algorithm
- goal state corresponds to error state
- plan corresponds to trace of error state

UNDER-APPROXIMATION REFINEMENT

- Challenge: state explosion problem
- Observation: used transitions often a small subset of all available transitions

| | GBFS | UT Search |
|------------|-------------|------------------|
| Ø A | 12.74% | 10.39% |
| Ø C | 16.25% | 11.58% |
| Ø D | 11.17% | 8.37% |
| Ø N | 74.41% | 71.64% |
| Ø M | 75.63% | 72.85% |

- Solution: evaluate and limit applicable transitions

DEFINITIONS

- Given: $A = \langle L, \Sigma, C, V, E, I, l_0 \rangle$

Under-approximation of A :

$UA = \langle L, \Sigma, C, V, E', I, l_0 \rangle$, where E' is a subset of E

- Given: $M = \{A_1, A_2, \dots, A_n\}$

Under-approximation of M :

$UM = \{UA_1, UA_2, \dots, UA_n\}$

APPROACH

Idea:

- Search on under-approximations
- Refine transition set if needed

Components:

- Search algorithm
- Refinement guard
- Refinement strategy

ALGORITHM

- Search algorithm: GBFS
 - Always expand most promising state
 - Store explored states in closed list
 - Store successors in open list

ALGORITHM

- Refinement guard: plateau, local minimum, empty open list

Refine if:

- successors do not improve the heuristic value
- open list is empty

ALGORITHM

- Refinement strategy:
 1. Relaxed plan of each state in closed list with minimal h
 2. Allow transitions of the relaxed plans
 - 3.a new transitions found:
 - reopen States of closed List with new transition
 - 3.b no transitions found:
 - repeat 1. with minimal $h + 1$
 - 3.c no transitions found and closed list completely scanned:
 - if open list is not empty: return to search
 - else: Allow applicable transitions of states with minimal h

IMPLEMENTATION

- Mcta
- h^U heuristic for relaxed plans
- Possible to use different search heuristics

SETUP

- 5 Test-sets: A, C, D, N, M
- Comparison with UT and GBFS
- All tests conducted 3 times

RESULTS FOR THE h^u HEURISTIC

| | runtime in s | | | used memory in MB | | | explored states | | | trace length | | |
|----|----------------|------|------|---------------------|----|-----|-----------------|----|------|--------------|----|----|
| | GBFS | UT | UA | GBFS | UT | UA | GBFS | UT | UA | GBFS | UT | UA |
| A2 | 0.0 | 0.0 | 0.0 | 60 | 60 | 60 | 25 | 20 | 20 | 21 | 18 | 18 |
| A3 | 0.0 | 0.01 | 0.0 | 61 | 61 | 61 | 82 | 27 | 46 | 18 | 17 | 17 |
| A4 | 0.01 | 0.04 | 0.01 | 62 | 62 | 62 | 39 | 34 | 131 | 28 | 22 | 23 |
| A5 | 0.48 | 0.17 | 0.08 | 72 | 68 | 72 | 4027 | 42 | 586 | 47 | 27 | 29 |
| A6 | - | 1.0 | 1.89 | - | 91 | 254 | - | 50 | 5564 | - | 32 | 35 |

RESULTS FOR THE h^u HEURISTIC

| | runtime in s | | | used memory in MB | | | explored states | | | trace length | | |
|----|----------------|-------------|-------------|---------------------|-----------|-----------|-----------------|-------------|-------------|--------------|------------|------------|
| | GBFS | UT | UA | GBFS | UT | UA | GBFS | UT | UA | GBFS | UT | UA |
| C1 | 0.01 | 0.01 | 0.01 | 61 | 61 | 61 | 429 | 243 | 239 | 67 | 54 | 55 |
| C2 | 0.01 | 0.02 | 0.01 | 61 | 61 | 61 | 828 | 212 | 239 | 83 | 54 | 55 |
| C3 | 0.01 | 0.02 | 0.01 | 61 | 61 | 61 | 1033 | 198 | 239 | 79 | 54 | 55 |
| C4 | 0.15 | 0.02 | 0.03 | 64 | 61 | 61 | 12k | 174 | 1117 | 112 | 55 | 64 |
| C5 | 0.86 | 0.03 | 0.04 | 78 | 61 | 61 | 65k | 147 | 1493 | 176 | 61 | 75 |
| C6 | 5.46 | 0.03 | 0.05 | 166 | 61 | 62 | 453k | 147 | 1493 | 432 | 61 | 75 |
| C7 | 45.42 | 0.04 | 0.05 | 974 | 61 | 62 | 4230k | 143 | 1493 | 924 | 61 | 75 |
| C8 | 31.46 | 0.32 | 0.09 | 758 | 62 | 63 | 3403k | 1466 | 2875 | 2221 | 56 | 161 |
| C9 | - | 0.36 | 0.2 | - | 62 | 66 | - | 1575 | 6119 | - | 69 | 169 |
| D1 | 0.05 | 0.11 | 0.02 | 61 | 61 | 61 | 1344 | 939 | 292 | 96 | 88 | 89 |
| D2 | 3.03 | 0.15 | 0.65 | 98 | 62 | 67 | 112k | 843 | 14k | 220 | 89 | 203 |
| D3 | 0.91 | 0.13 | 0.06 | 75 | 62 | 62 | 44k | 717 | 1228 | 241 | 89 | 95 |
| D4 | 6.36 | 0.15 | 3.31 | 138 | 62 | 94 | 259k | 615 | 83k | 410 | 89 | 262 |
| D5 | 0.22 | 11.76 | 0.06 | 64 | 125 | 62 | 4455 | 87k | 720 | 115 | 107 | 108 |
| D6 | 0.52 | - | 0.59 | 67 | - | 67 | 12k | - | 7490 | 301 | - | 206 |
| D7 | 0.82 | 4.8 | 2.49 | 70 | 80 | 85 | 20k | 18k | 34k | 154 | 109 | 128 |
| D8 | 1.01 | 0.63 | 121.53 | 72 | 64 | 1186 | 23k | 1883 | 1808k | 259 | 109 | 253 |
| D9 | - | 0.59 | - | - | 64 | - | - | 1533 | - | - | 110 | - |

RESULTS FOR THE h^u HEURISTIC

| | runtime in s | | | used memory in MB | | | explored states | | | trace length | | |
|-----------|----------------|------|-------------|---------------------|-----------|-----------|-----------------|-------------|-------------|--------------|-----------|------------|
| | GBFS | UT | UA | GBFS | UT | UA | GBFS | UT | UA | GBFS | UT | UA |
| M1 | 0.02 | 0.06 | 0.01 | 61 | 61 | 61 | 7668 | 4366 | 1529 | 71 | 73 | 66 |
| M2 | 0.06 | 0.05 | 0.02 | 63 | 61 | 61 | 18k | 2018 | 3852 | 119 | 81 | 105 |
| M3 | 0.06 | 0.39 | 0.02 | 63 | 64 | 61 | 19k | 17k | 4794 | 124 | 163 | 93 |
| M4 | 0.14 | 0.5 | 0.05 | 68 | 66 | 63 | 46k | 15k | 12k | 160 | 91 | 148 |
| N1 | 0.05 | 0.09 | 0.02 | 62 | 62 | 61 | 9117 | 5191 | 1880 | 99 | 80 | 68 |
| N2 | 0.14 | 0.09 | 0.06 | 66 | 62 | 63 | 23k | 3260 | 8106 | 154 | 136 | 103 |
| N3 | 0.27 | 0.41 | 0.06 | 69 | 65 | 63 | 43k | 19k | 7117 | 147 | 149 | 87 |
| N4 | 1.08 | 0.46 | 0.19 | 88 | 67 | 67 | 152k | 15k | 25k | 314 | 377 | 185 |

PLATEAU GUARD

- Problem: many useless refinements

| | # of refinements |
|---------------|------------------|
| $\emptyset A$ | 1076 |
| $\emptyset C$ | 938 |
| $\emptyset D$ | 97934 |
| $\emptyset M$ | 3493 |
| $\emptyset N$ | 7273 |

- Idea: ignore small plateaus and local minima
- Proposed solution: plateau guard

PLATEAU GUARD

- Problem: many useless refinements
- Idea: ignore small plateaus and local minima
- Proposed solution: plateau guard
 - Counter for encountered plateaus and local minima
 - Refine only if counter reaches a set value
 - Reset counter to 0 after refinement

PLATEAU GUARD

| Guard | # of refinements | | | | | | | | | | | | |
|-------|------------------|-------|------|------|-----|-----|-----|-----|----|------|----|------|----|
| | 0 | 5 | 10 | 25 | 50 | 100 | 150 | 500 | 1k | 1.5k | 2k | 2.5k | 5k |
| ØA | 1076 | 182 | 100 | 43 | 23 | 13 | 9 | 4 | 3 | 2 | 2 | 2 | 2 |
| ØC | 938 | 151 | 83 | 26 | 16 | 11 | 10 | 9 | 9 | 9 | 9 | 9 | 10 |
| ØD | 97934 | 16392 | 8801 | 3183 | 77 | 30 | 15 | 14 | 13 | 14 | 14 | 14 | 14 |
| ØM | 3493 | 643 | 339 | 146 | 67 | 43 | 27 | 14 | 12 | 12 | 12 | 11 | 11 |
| ØN | 7273 | 1250 | 674 | 283 | 137 | 65 | 48 | 20 | 15 | 13 | 12 | 11 | 11 |

PLATEAU GUARD

| Guard | runtime in s | | | | | | | | | | | | |
|-------|--------------|--------|--------|-------------|-------------|-------------|-------------|------|-------------|------|-------|-------------|------|
| | 0 | 5 | 10 | 25 | 50 | 100 | 150 | 500 | 1k | 1.5k | 2k | 2.5k | 5k |
| ØA | 0.4 | 0.35 | 0.37 | 0.39 | 0.35 | 0.36 | 0.37 | 0.4 | 0.37 | 0.33 | 0.28 | 0.25 | 0.47 |
| ØC | 0.05 | 0.05 | 0.05 | 0.04 | 0.04 | 0.05 | 0.06 | 0.1 | 0.1 | 0.14 | 0.13 | 0.14 | 0.18 |
| ØD | 16.09 | 16.47 | 15.62 | 13.81 | 0.52 | 0.42 | 0.21 | 0.32 | 0.34 | 0.54 | 0.46 | 0.78 | 0.6 |
| ØM | 0.03 | 0.03 | 0.03 | 0.03 | 0.02 | 0.03 | 0.03 | 0.04 | 0.04 | 0.04 | 0.05 | 0.05 | 0.06 |
| ØN | 0.08 | 0.07 | 0.08 | 0.08 | 0.07 | 0.06 | 0.07 | 0.08 | 0.09 | 0.1 | 0.12 | 0.14 | 0.19 |
| D8 | 121.53 | 124.97 | 120.03 | 106.4 | 0.06 | 0.37 | 0.13 | 0.3 | 0.46 | 0.72 | 0.73 | 1.98 | 0.9 |
| D9 | - | - | - | - | - | - | - | - | 2.18 | 3.63 | 18.61 | 5.69 | 9.46 |

CONCLUSION

- Successful adaptation and implementation
- Fast and memory efficient algorithm
- Similar performance to UT
- Improvements possible with minor changes

FUTURE WORK

- Test different refinement guards
- Test different refinement strategies
- Evaluation on more diverse test-sets

Thank you for your attention