FACULTY OF NATURAL, MATHEMATICAL & ENGINEERING SCIENCES

DEPARTMENT OF INFORMATICS

KING'S College LONDON

Formalising Mathematics to Obtain Verified AI and Optimisation Software

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A Motivation: Software and Hardware Failures

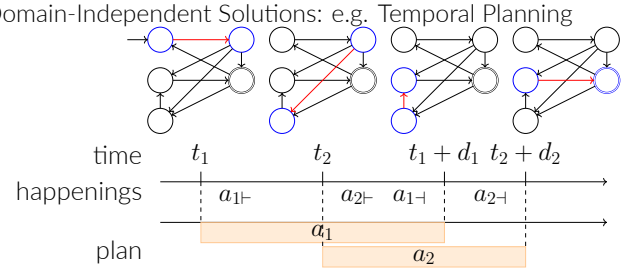
- Post Office Scandal(SF, > 900 postmasters wrongly convicted)
- Pentium FDIV (HF, flawed floating-point unit in processor)
- Therac-25 (SF, excessively high doses in radiation therapy)
- Boeing 737 (SF, screen blackouts when approaching specific runways, flight control)

Interactive Theorem Proving (ITP) and Isabelle

- Interactive Theorem Proving = Writing (partial) proofs s.t. they can be completed + checked by software
- Interactive Theorem Prover/Proof Assistant = Software to complete and check proofs
- We use Isabelle/HOL (others Coq/Rocq, Lean, etc.)
- Trustworthy Software
- In-depth understanding/explanation of behaviour

AI Planning

- See: https://formplan.github.io/
- Abstract Problem Representation: (1) Logic: e.g.
  $s \vDash \forall r{::}robot.\ \forall o{::}object.$
  $\text{weight}(o) \leq \text{capacity}(r) \wedge \neg\text{broken}(r) \wedge \ldots \longrightarrow \text{can\_carry}(r,o)$
  (2) Probabilities: e.g. Markov Decision Processes
- Domain-Independent Solutions: e.g. Temporal Planning

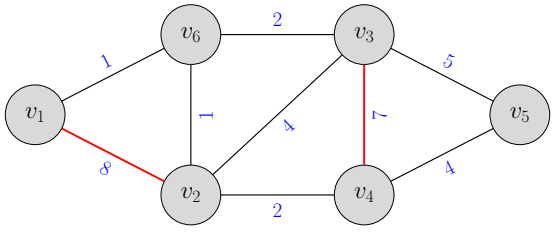


Find a schedule of concurrent actions that transform the initial state until a goal is satisfied. E.g. $s \vDash \forall x{::}task.\ \text{completed}(x)$

- Isabelle formalisation of a part of the Planning Domain Definition Language (PDDL) and its semantics based on abstract timed transition systems

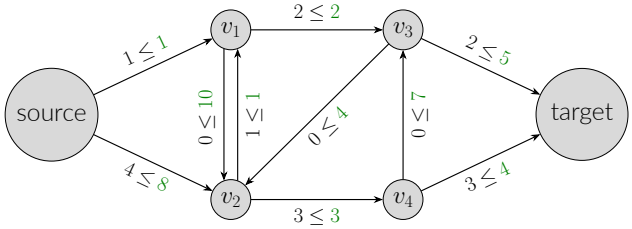
Examples for Combinatorial Optimisation (CO)

- Matching (certain one-to-one pairings allowed, selection from these, e.g. by Edmonds' Blossom Algorithm):



Combinatorial Optimisation (continued)

- Flows (send liquid from source to target while respecting connection capacities, e.g. by Ford-Fulkerson method):



Verifying Algorithms

- Planning and CO problems can be solved by algorithms
- Isabelle/HOL formalisation of mathematical theory to verify these algorithms
- Library for graph algorithms (together with collaborators): flows, matchings, matroids, spanning trees etc.
- Running Time: Time waiting for solution in relation to size of problem description
- Correctness guarantee for result if using verified code

Applications of Planning and CO Problems

Matching:

- Kidney Exchange in UK and Scandinavia [2, 8]
- Student-College Matching with preferences and fairness [1]
- Auctions and Market Design, e.g. Google's Adwords [17]

Flows:

- Electricity Grid Congestion, Pipe Network Analysis, and other transportation subject to capacities and costs
- Circuit and other Hardware Design. Esp. Very Large Scale Integration (VLSI), e.g. decrease of chip area by 23% [9], reduction of wire length by 10% [11], minimise cell movement [4], and others [5, 7, 13])

Planning:

- Logistics [20] (minimising costs of moving vessels), Enterprise Risk Management [19, 12] (e.g. Scenario Planning: i.e. modelling risk scenarios)
- Robotics [6], Space Exploration [14, 10, 15, 18] (e.g. optimising data up- and downlink times, providing reasoning capabilities to autonomous agents) + Terrestrial Exploration [16, 3] (e.g. improving returns of earth-observing satellites, guidance for autonomous underwater vehicles)

Further Remarks

Given the advantages of verification, also consider:

- Verification Effort vs. Increased Trustworthiness
- Unverified Assumptions (e.g. Compiler, Hardware)
- Good Running Time (thus high complexity) vs. Verification Effort
- for more info, go to https://fm-vs.github.io/

Formalising Mathematics to Obtain Verified AI and Optimisation Software: References

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