

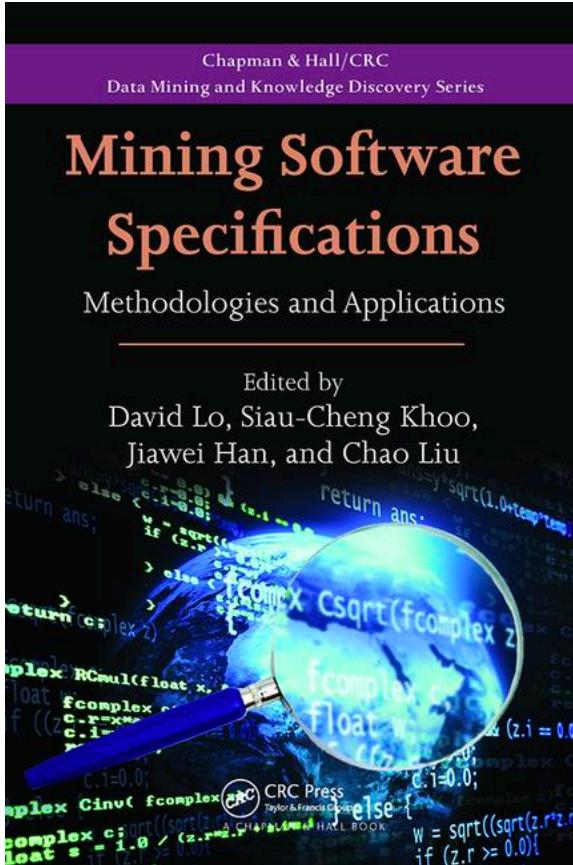
# An Empirical Study On Practicality Of Specification Mining Algorithms On A Real-world Application

**Mohammad Jafar Mashhadi**

Hadi Hemmati



## Idea: Using Specification Mining for Debugging



## Case Study: Autopilot software



# UAVs

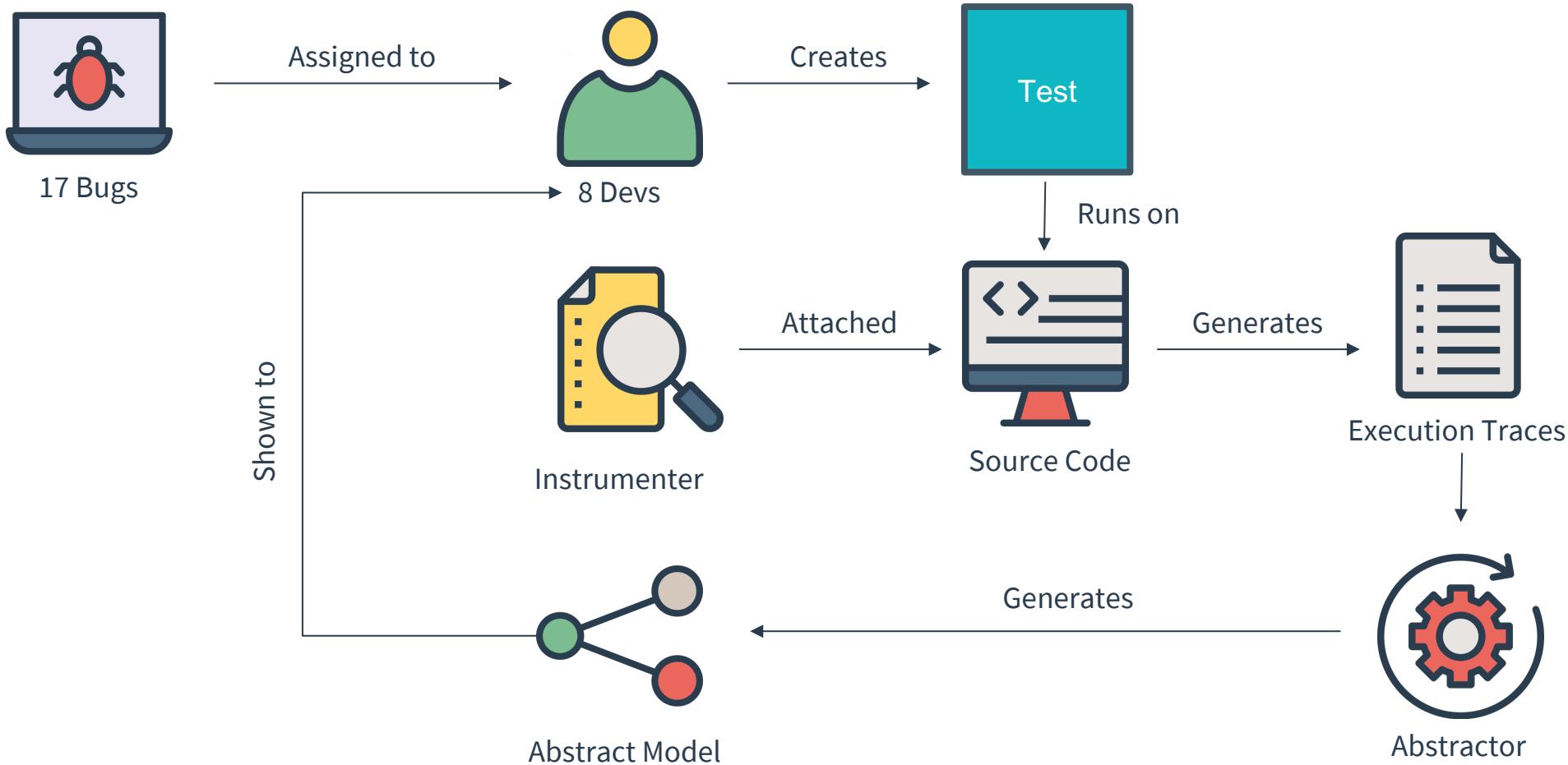
Fixed wing  
Heli / Multirotor  
VTOL  
Crop cam drone  
blimps

# 1000+ Customers

# 85 Countries

# 500K LoC in C

## Experiment Process Design – Big Picture



## Experiment Process Design in This Study

Our focus:

- ▶ Instrumenter
- ▶ Abstractor

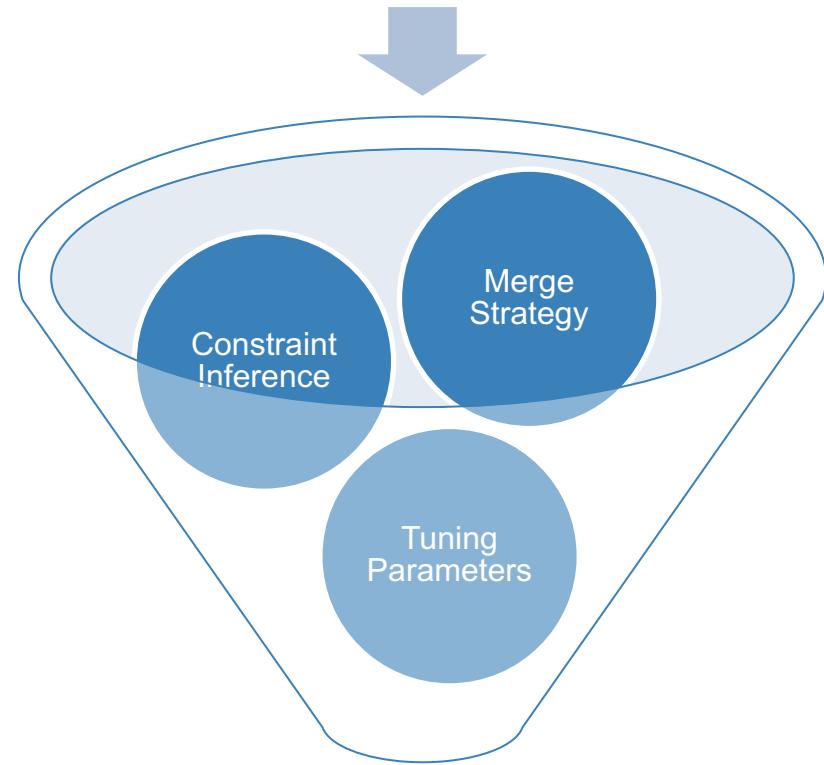
The challenges we faced while using existing tools and algorithms on 2 out of 17 bugs

Modular and Configurable:

- ▷ Different Merge Strategies
  - ▶ k Tails
  - ▶ G<sub>k</sub> Tail
  - ▶ EDSM (red-blue)
  - ▶ Exhaustive Merge
  - ▶ Noloops
- ▷ Careful Determinization
- ▷ Using Daikon

and more

Execution Traces



EFSM

# Challenges

Instrumentation

Abstraction

Interpretation

## Instrumentation

- ▶ Too Many Events

## Abstraction

## Interpretation

**100s of GBs of  
data  
In a matter of  
MINUTES**

## Instrumentation

- ▶ Too Many Events
- ▶ Complex Variables

## Abstraction

## Interpretation

**100+ KB** data structure

**Nested**

**With \*Pointers arrays, structs, buffers,...**

## Instrumentation

- ▶ Too Many Events
- ▶ Complex Variables
- ▶ Irrelevant Variables

## Abstraction

## Interpretation

**Not Relevant to  
The Bug**

# Challenges

## Instrumentation

- ▶ Too Many Events
- ▶ Complex Variables
- ▶ Irrelevant Variables
- ▶ Boilerplate Code

## Abstraction



```
template<async_overflow_policy OverflowPolicy = async_overflow_policy::block>
struct async_factory_impl
{
    template<typename Sink, typename... SinkArgs>
    static std::shared_ptr<async_logger> create(std::string logger_name, SinkArgs &&
    {
        auto &registry_inst = details::registry::instance();

        // create global thread pool if not already exists..
        std::lock_guard<std::recursive_mutex> tp_lock(registry_inst.tp_mutex());
        auto tp = registry_inst.get_tp();
        if (tp == nullptr)
        {
            tp = std::make_shared<details::thread_pool>(details::default_async_q_size);
            registry_inst.set_tp(tp);
        }

        auto sink = std::make_shared<Sink>(std::forward<SinkArgs>(args)...);
        auto new_logger = std::make_shared<async_logger>(std::move(logger_name), std::move(tp), OverflowPolicy);
    }
}
```

## Interpretation

## Instrumentation

- ▶ Too Many Events
- ▶ Complex Variables
- ▶ Irrelevant Variables
- ▶ Boilerplate Code

## Abstraction

## Interpretation

Solution: Making a whitelist of tracked functions and variables

## Instrumentation

## Abstraction

## Interpretation

## ▶ Input Redundancy

All work and no play makes Jack a dull boy  
All work and no play makes Jack a dull boy  
All work and no play mmakes Jack a dull boy  
v All work and no PLay ma es Jack a dull boy  
Allworkand noplaymakesJack a dull boy  
All work and no play makes Jack a dullboy.  
All work and no play makes Jack a dull boy  
All work and notplay makes Jack a dull boy  
All work and nopEay makes Jack a dull boy  
All work a\_id no play makes Jack a dull boy  
All work and no play makes Jack a dull boy  
All work andno play makes Jack a dull boy  
All work and noplaymakesjack a dullboy  
  
All work and no play makes Jack a dull boy

Instrumentation

Abstraction

Interpretation

- ▶ Input Redundancy

Removing adjacent identical events

**98% size reduction**

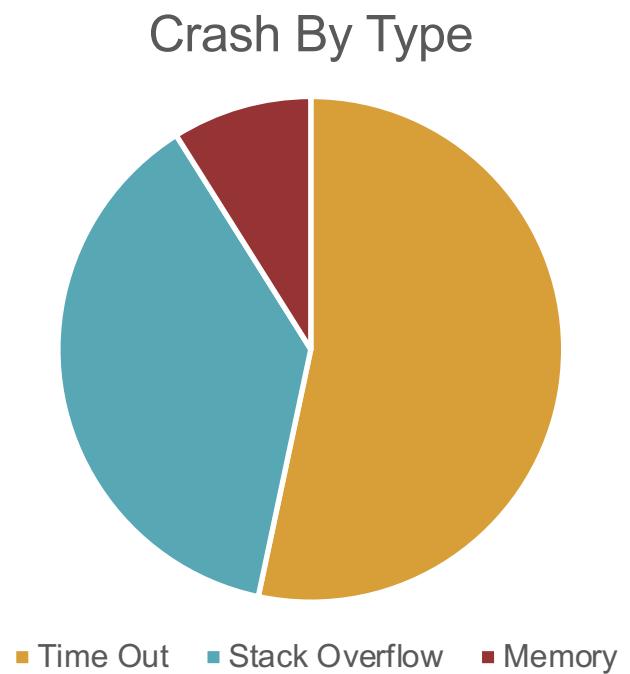
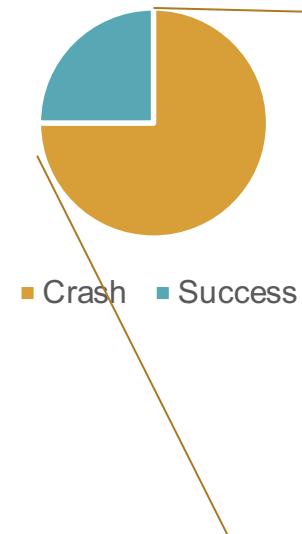
## Instrumentation

## Abstraction

## Interpretation

Failure Type	Frequency
Time Out	40%
Stack Overflow	28.3%
Memory run out	6.7%

- ▶ Input Redundancy
- ▶ Crashing



## Instrumentation

## Abstraction

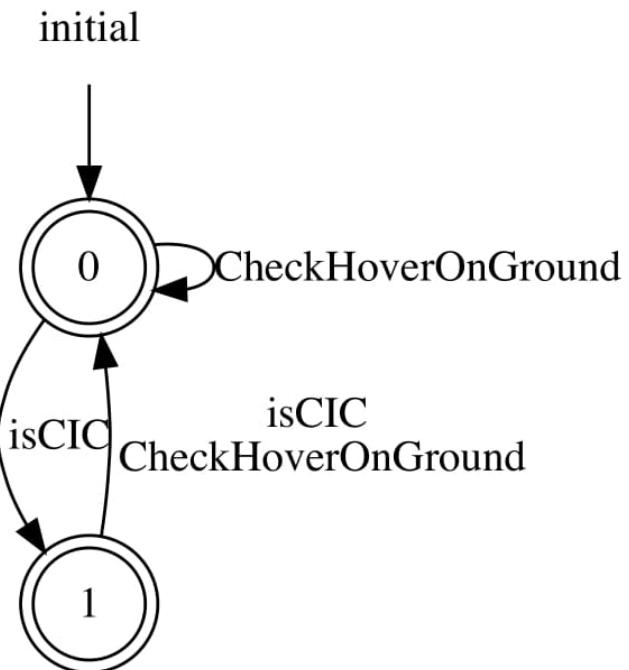
## Interpretation

- ▶ Input Redundancy
- ▶ Crashing

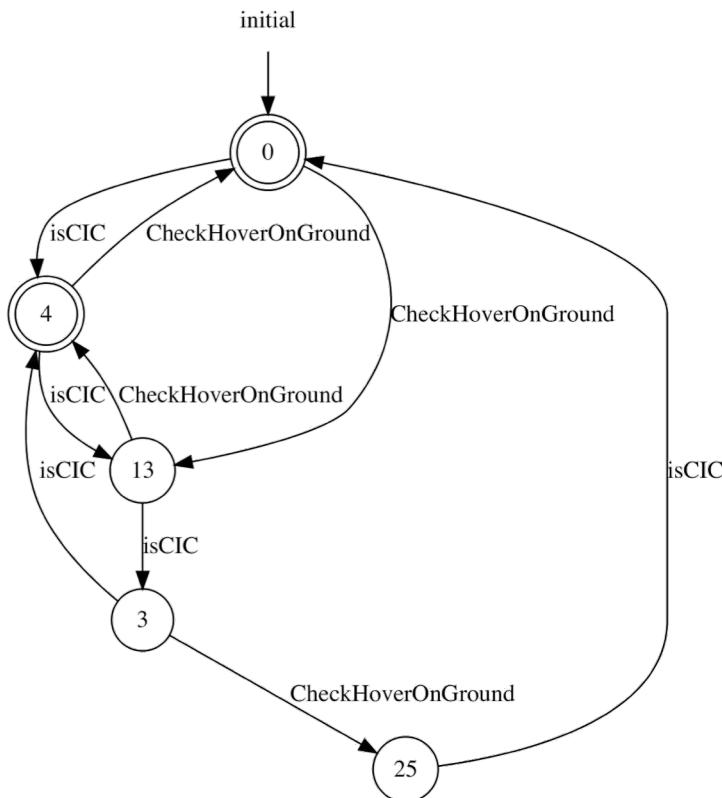
Solution: Rewriting recursive functions, using iteration

Or optimising the implementation in general

## Instrumentation

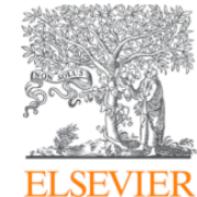


## Abstraction



## Interpretation

- ▷ No Constraints
- ▷ Low Control on Granularity



## Information and Software Technology

Available online 7 May 2019

In Press, Corrected Proof



# Interactive semi-automated specification mining for debugging: An experience report

Mohammad Jafar Mashhadi <sup>a</sup>✉, Taha R. Siddiqui <sup>b</sup>✉, Hadi Hemmati <sup>✉,a</sup>, Howard Loewen <sup>c</sup>✉

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<https://doi.org/10.1016/j.infsof.2019.05.002>

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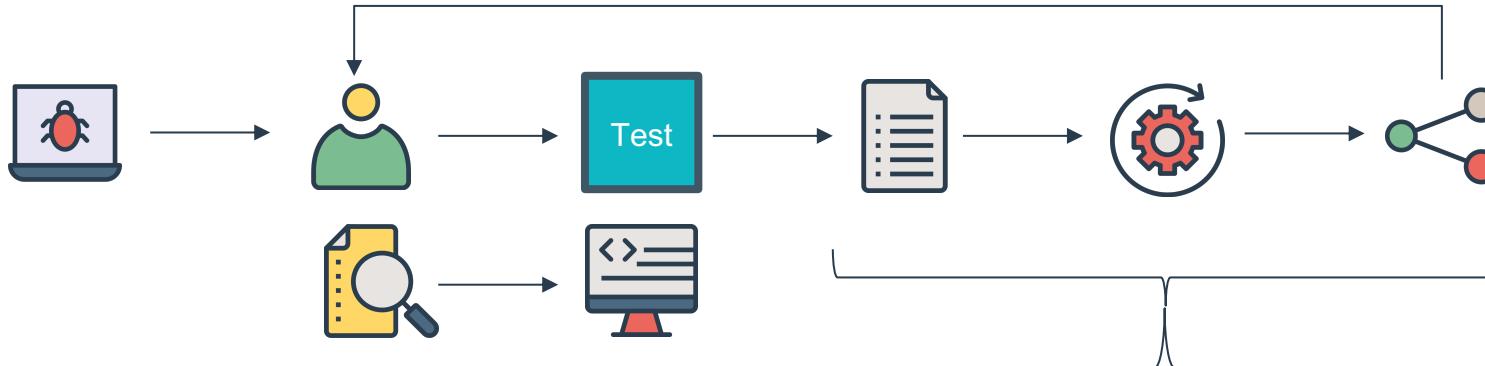
### Abstract

### Context

Specification mining techniques are typically used to extract the specification of a software in the absence of (up-to-date) specification documents. This is useful for

## Take home messages

- ▶ Current specification mining algorithms are quite good, but their evaluation and application on large-scale and industrial settings can be improved.
  
- ▶ Pushing for full-automation can sometimes hurt practical applicability



### Instrumentation

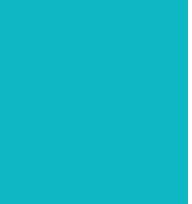
- ▷ Too Many Events
- ▷ Complex Variables
- ▷ Irrelevant Variables
- ▷ Boilerplate Code

### Abstraction

- ▷ Input Redundancy
- ▷ Crashing
  - ▷ Timing Out
  - ▷ Stack Overflow
  - ▷ Out of Memory

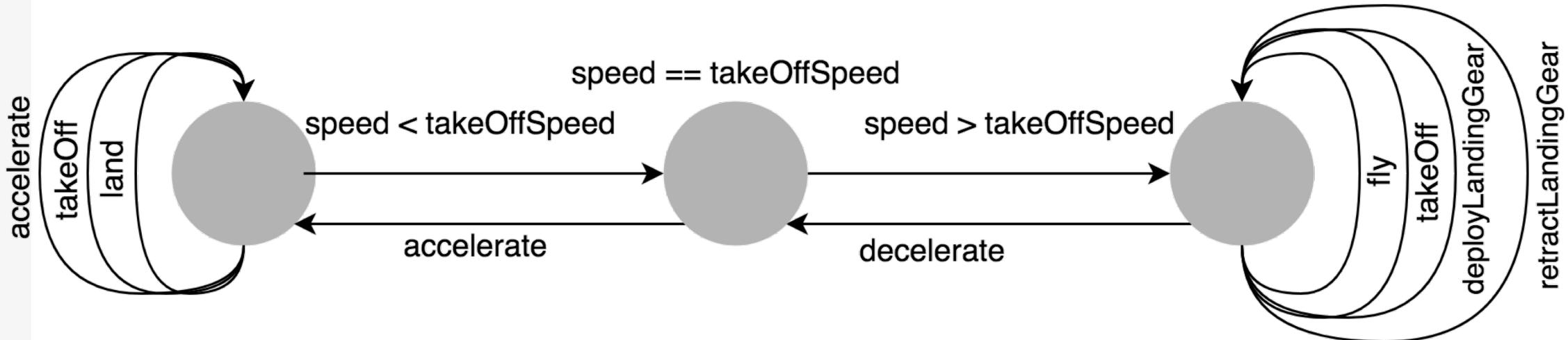
### Interpretation

- ▷ No Constraints
- ▷ Low Control on Granularity



Which model works better?

## Extended Finite State Machines



## Why EFMSs are good?

1. The big picture
  - ▶ They are Intuitive and easy to use and show the whole behaviour in a glance
2. They show states!  
The software in our study is state-based
3. Constraints  
They contain the data associations
4. The algorithms and tools  
There are multiple algorithms available for state-machine inference in addition to their implementation