

Model Checking for Autonomy Software

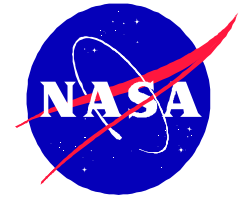
Charles Pecheur

RIACS / ASE Group, NASA Ames

Model Checking for Autonomy Software

- **Why?**
Autonomy software, how to verify it?
- **What?**
A bird's-eye view of model checking
- **How?**
Experiences in the ASE Group

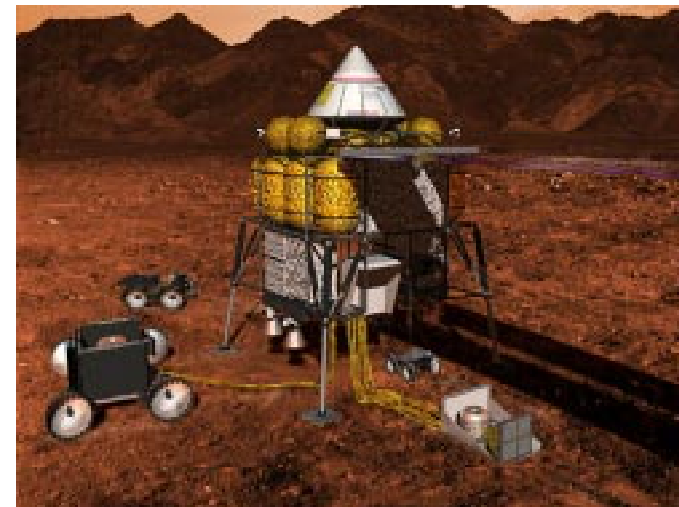
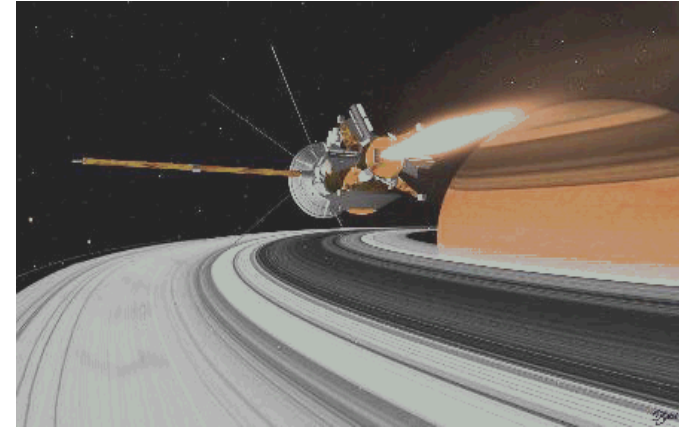
Autonomous Systems



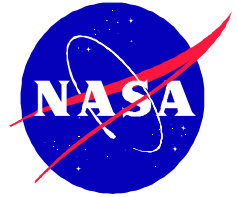
"Faster, better, cheaper" spacecrafts

=> add on-board intelligence

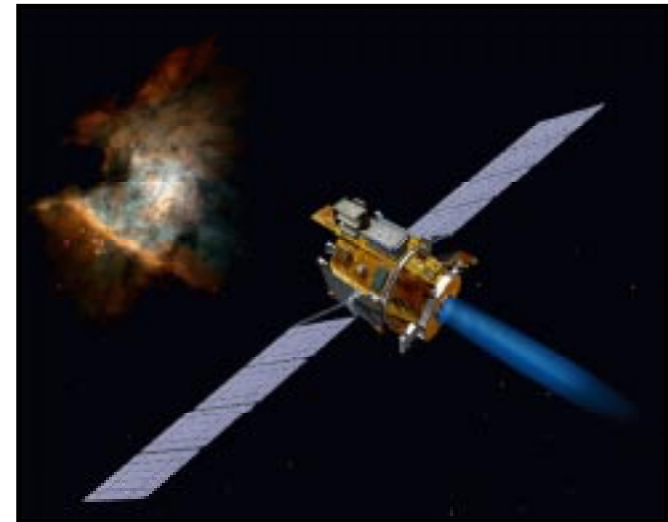
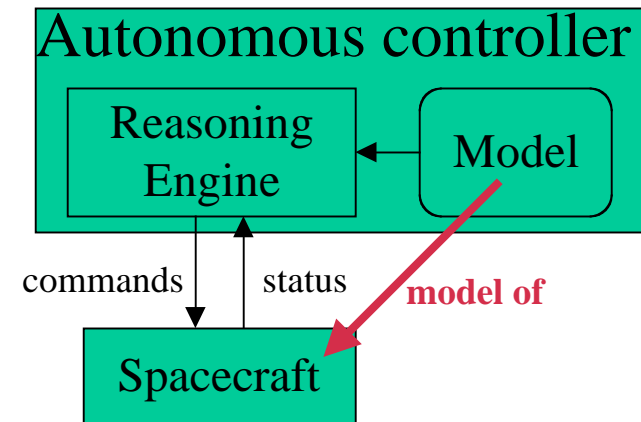
- From self-diagnosis to on-board science.
- Smaller mission control crews => reduced cost
- Less reliance on control link => OK for deep space



Model-Based Autonomy

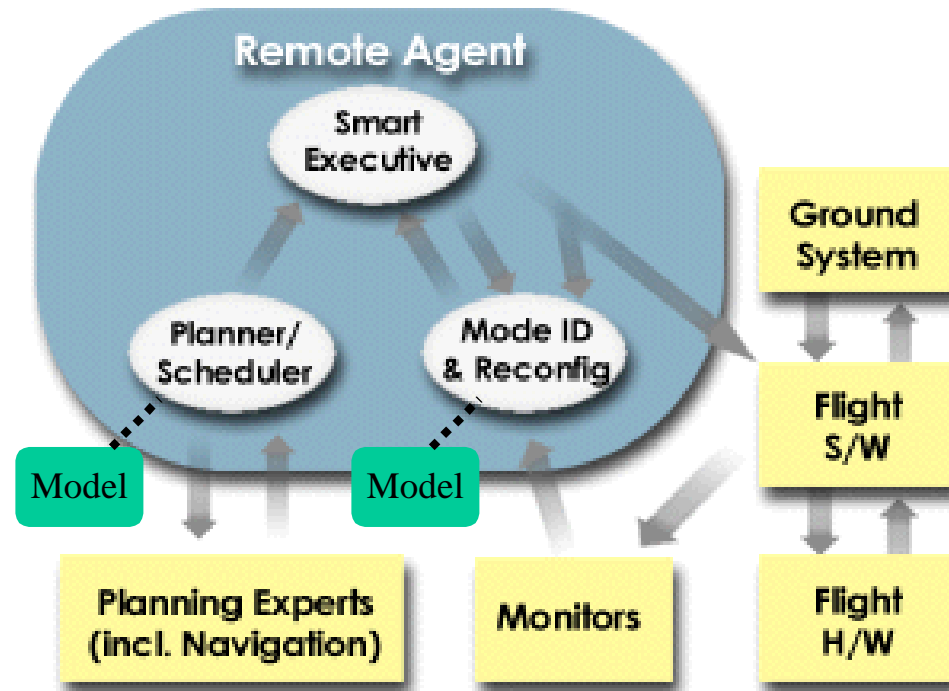


- Based on AI technology
- General reasoning engine + application-specific model
- Use model to respond to unanticipated situations

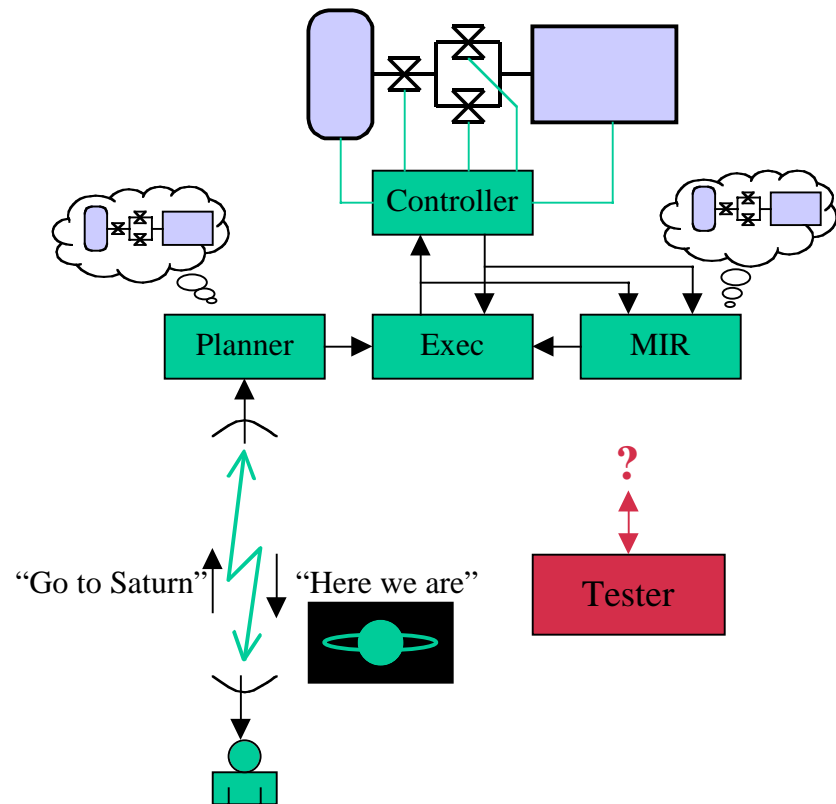
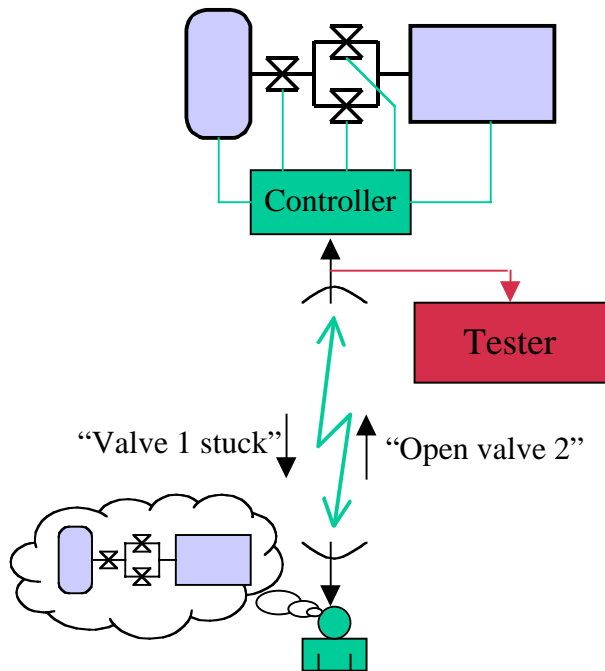
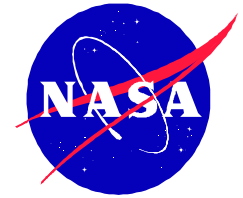


Example: Remote Agent

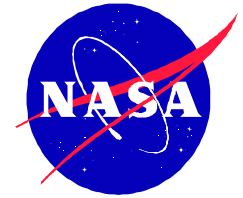
- From Ames ARA Group (+ JPL)
- On Deep Space One in May 1999 (1st AI in space!)



Controlled vs. Autonomous



Testing Autonomy Software?

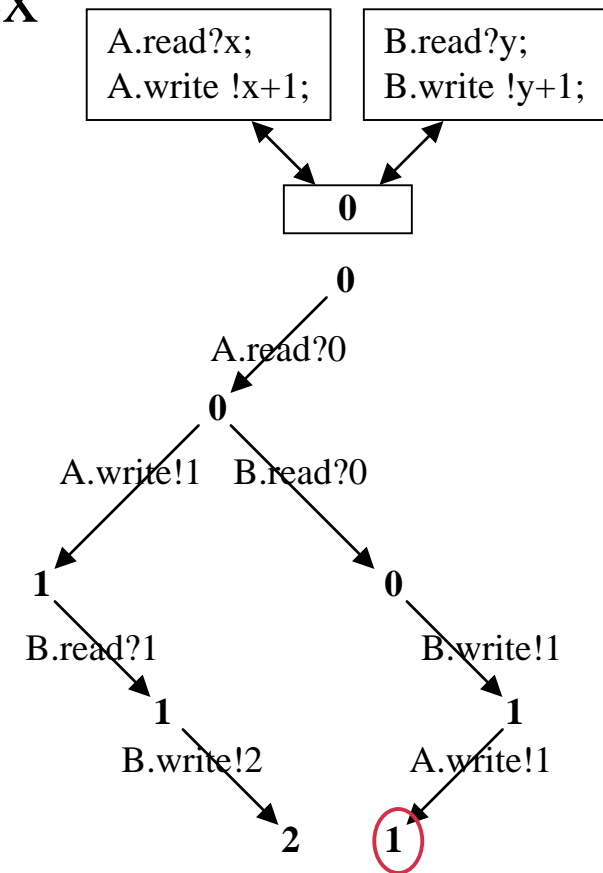


- Programs are much more complex
 - Many more scenarios
- => testing gives low coverage

- **Concurrency!**

Due to scheduling,
the same inputs (test) can give
different outputs (results)

=> test results are not reliable



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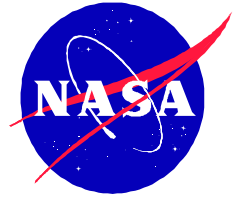
Experiences in the ASE Group

Model Checking

Check whether a system S satisfies a property P by exhaustive exploration of all executions of S

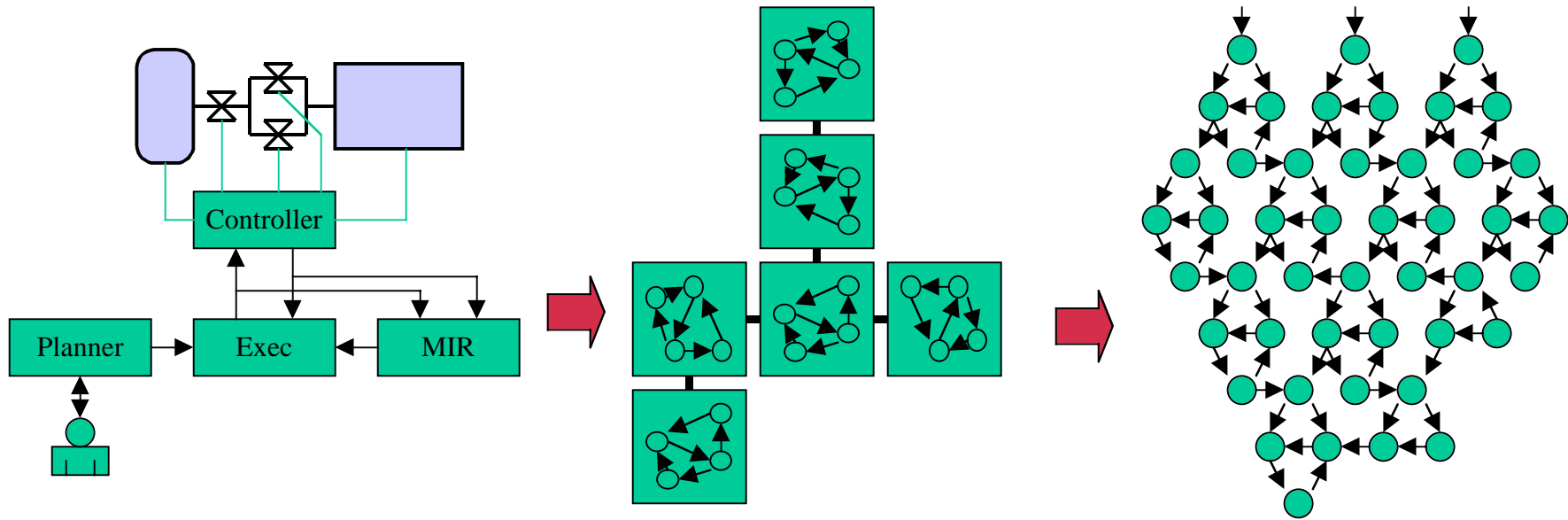
- Controls scheduling \Rightarrow better coverage
- Can be done at early stage \Rightarrow less costly
- Widely used in hardware, coming in software
- Examples: **Spin** (Bell Labs), **Murphi** (Stanford)

Model ...



Modeling
Abstraction

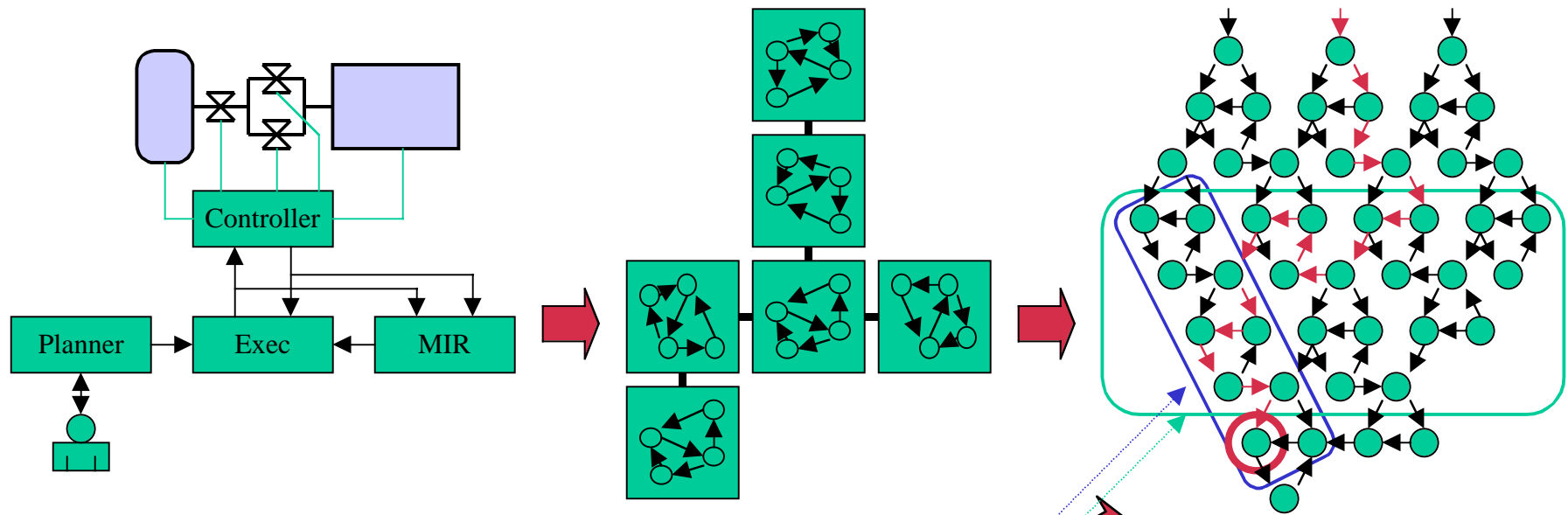
Verification



Model Checking

Modeling
Abstraction

Verification



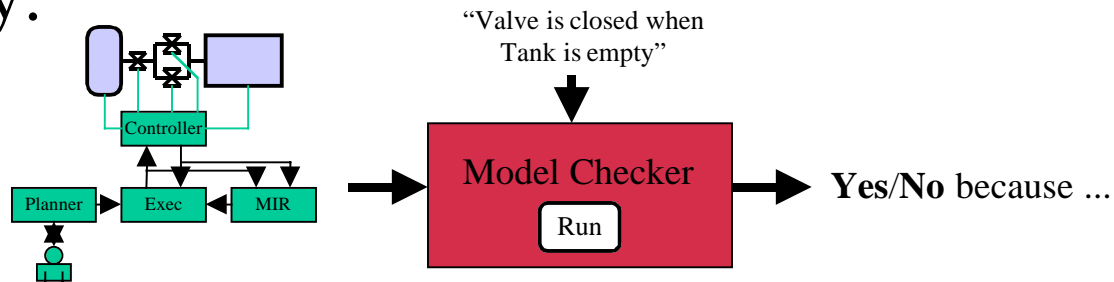
“Valve is closed when
Tank is empty”

AG (tank=empty
=> valve=closed)

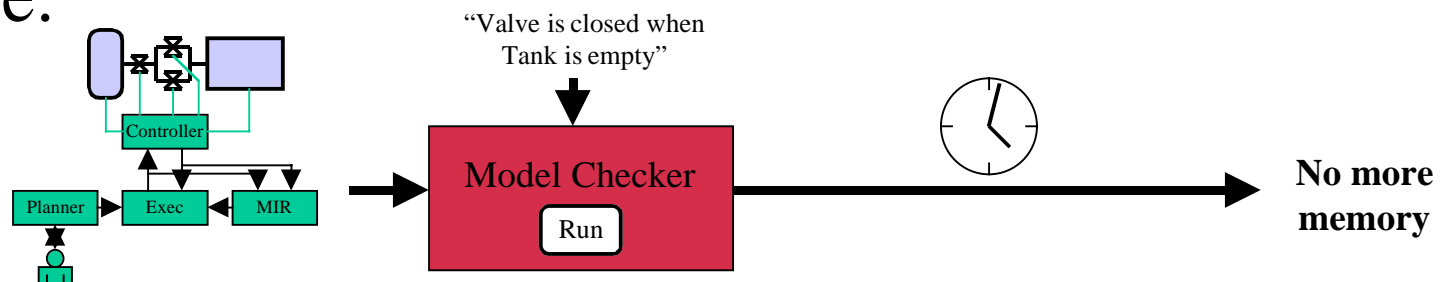
State Space Explosion

K processes with N local states $\leq N^K$ global states

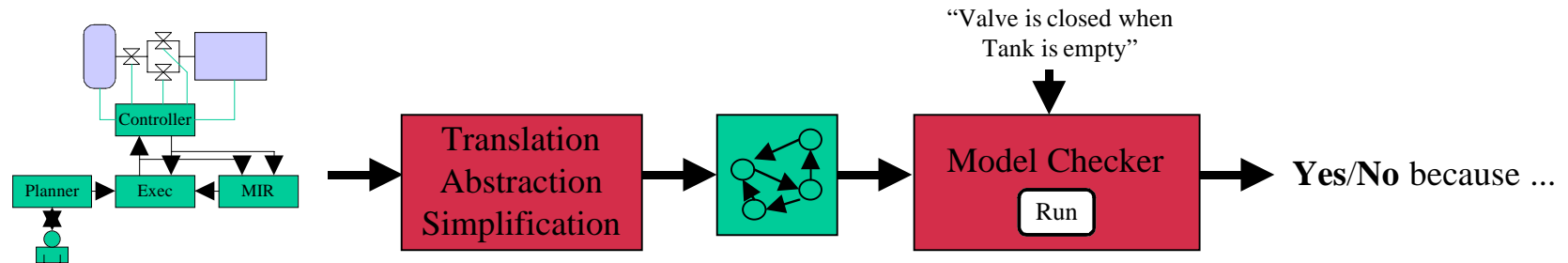
Theory:



Practice:



Modeling



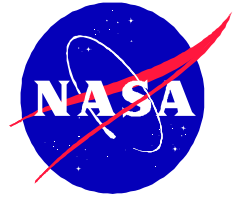
This is the tough job!

- **Translation:** to model checker's syntax
e.g. C \rightarrow Promela (Spin)
- **Abstraction:** ignore irrelevant parts
e.g. contents of messages
- **Simplification:** downsize relevant parts
e.g. number of processes, size of buffers

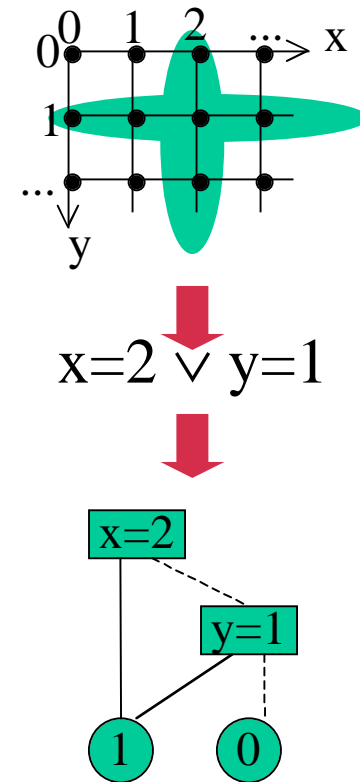
Temporal Logic

- Propositional logic + quantifiers over executions
- Example: "every request gets a response"
AG (Req \Rightarrow **AF** Resp)
Always Globally, if Req then Always Finally Resp
- Branching (CTL) vs. linear (LTL)
 - different verification techniques
 - neither is more general than the other
- Model checking without TL
 - Assertions, invariants
 - Compare systems, observers

Symbolic Model Checking



- Manipulates **sets of states**,
Represented as **boolean formulas**,
Encoded as **binary decision diagrams**.
- Can handle larger state spaces (10^{50} and up).
- BDD computations:
 - Good in average but exponential in worst case.
 - Computation time depends on BDD size
=> number of variables, complexity of formulas,
but not directly state space size.
- Example: **SMV** (Carnegie Mellon U.)

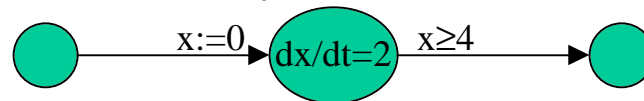


Real-Time and Hybrid

- "Classic" model checking: finite state, un-timed
- Real-time model checking: add clocks
e.g. Khronos (Verimag), Uppaal (Uppsala/Aalborg)



- Hybrid model checking: add derivatives
e.g. Hytech (Berkeley)

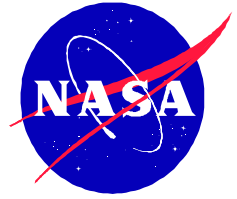


More complex problems & less mature tools

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Experiences in the ASE Group

Verification of Remote Agent Executive



(Lowry, Havelund and Penix)

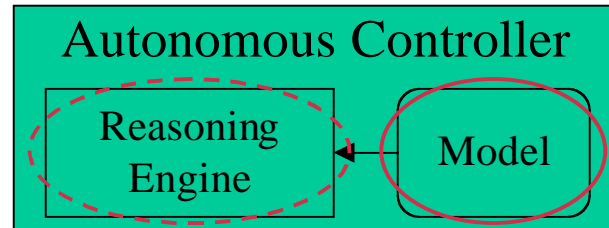
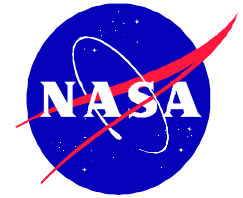
- Smart executive system with AI features (Lisp)
- Modeled (1.5 month) and
Model-checked with Spin (less than a week)
- **5 concurrency bugs found**, that would have been
hard to find through traditional testing

Hunting the RAX Bug

(Lowry, White, Havelund, Pecheur, ...)

- 18 May 1999: Remote Agent Experiment suspended following a deadlock in RA EXEC
=> **Q: could V&V have found it?**
- Over-the-week-end "clean room" experiment:
 - Front-end group selects suspect sections of the code
 - Back-end group does modeling (in Java) and verification (using Java Path Finder + Spin)
- => **A: V&V found it... two years ago!**
Same as one of the 5 concurrency bugs found before
- **Morale: Testing not enough for concurrency bugs!**

Verification of Model-Based Autonomy



Reasoning Engine

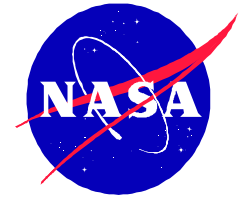
- Relatively small, generic algorithm => use **prover**
- Requires **V&V expert** level but **once and for all**
- At application level, assume correctness (cf. compiler)

Model

- Complex assembly of interacting components => **model checking**
- Avoid V&V experts => **automated translation**
Not too hard because models are abstract

Reasoning Engine + Model ???

Verification of Planner/Scheduler Models

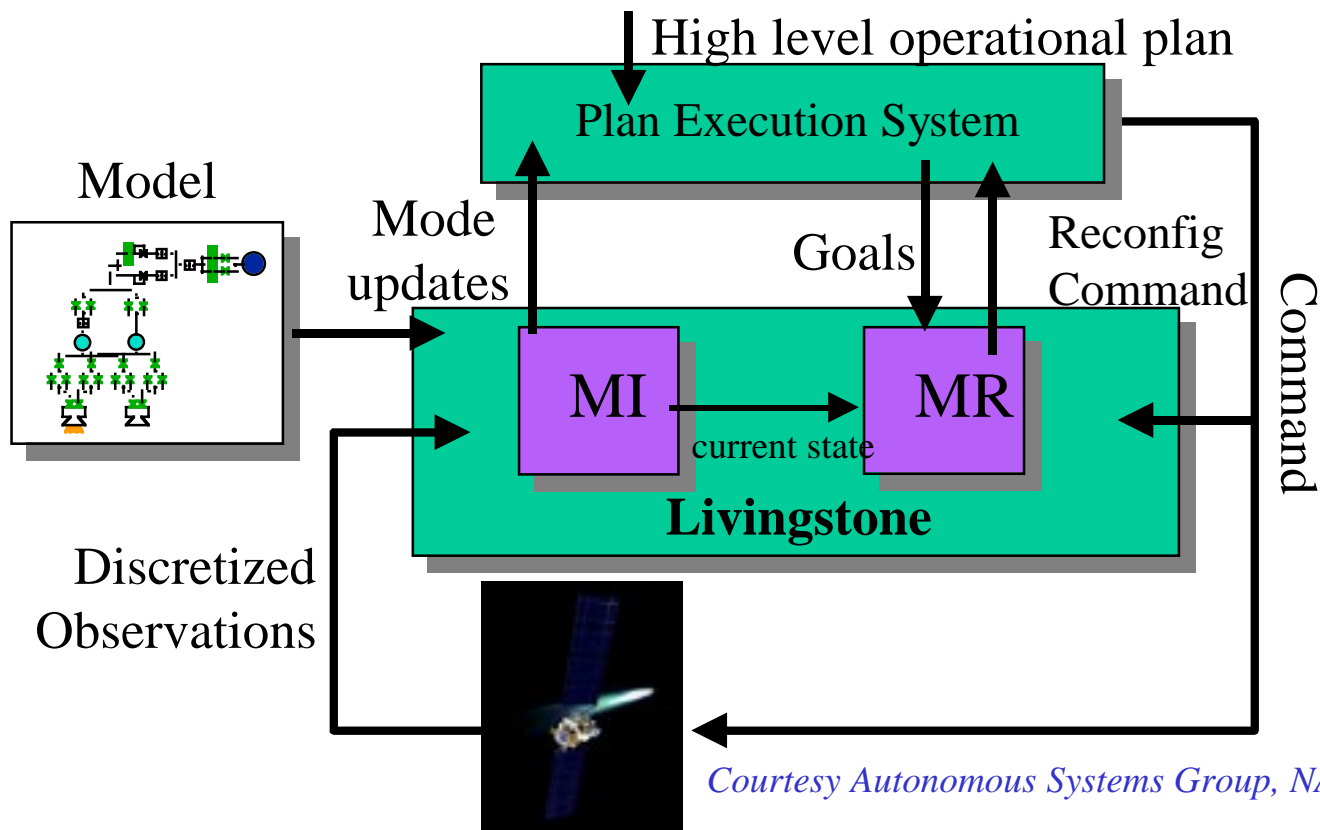


(Penix, Pecheur and Havelund)

- Model-based planner from Remote Agent
Models: constraint style, real-time
- Small sample model translated by hand
Subset of the full modeling language, untimed
- Compare 3 model checkers: Spin, Murphi, SMV
=> SMV much easier and faster ($\approx 0.05s$ vs. $\approx 30s$)
- Continuation (*Khatib*): handle timed properties
using real-time model checker (Uppaal)

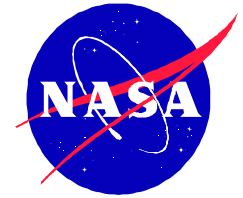
The Livingstone MIR

Remote Agent's model-based fault recovery sub-system



Courtesy Autonomous Systems Group, NASA Ames

Livingstone to SMV Translation



Livingstone Model

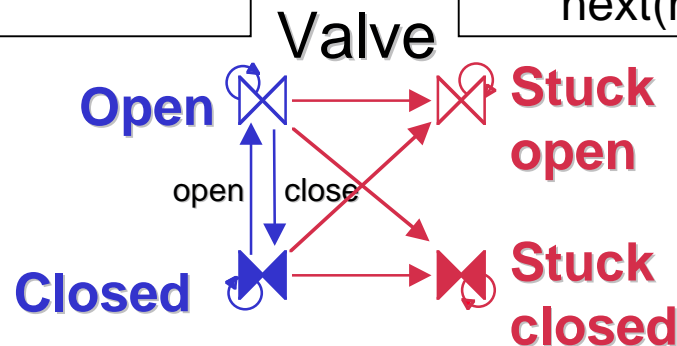
```
(defcomponent valve ()
  (:inputs (cmd :type valve-cmd))
  ...
  (Closed :type ok-mode
   :transitions
   ((do-open :when (open cmd)
    :next Open) ...))
  (StuckC :type :fault-mode ...)
  ...)
```

Livingstone
Autonomous
Controller

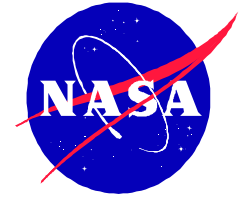
SMV Model

```
MODULE valve
VAR   mode: {Open,Closed,
            StuckO,StuckC};
      cmd: {open,close};
DEFINE faults:={StuckO,StuckC};
TRANS
  (mode=Closed & cmd=open) ->
    (next(mode)=Open |
     next(mode) in faults)
```

SMV
Symbolic
Model Checker



From Livingstone Models to SMV Models

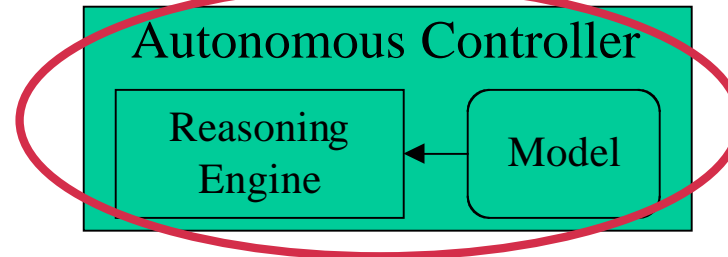
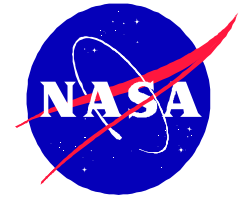


(Simmons, Pecheur)

Translation program developed by CMU and Ames

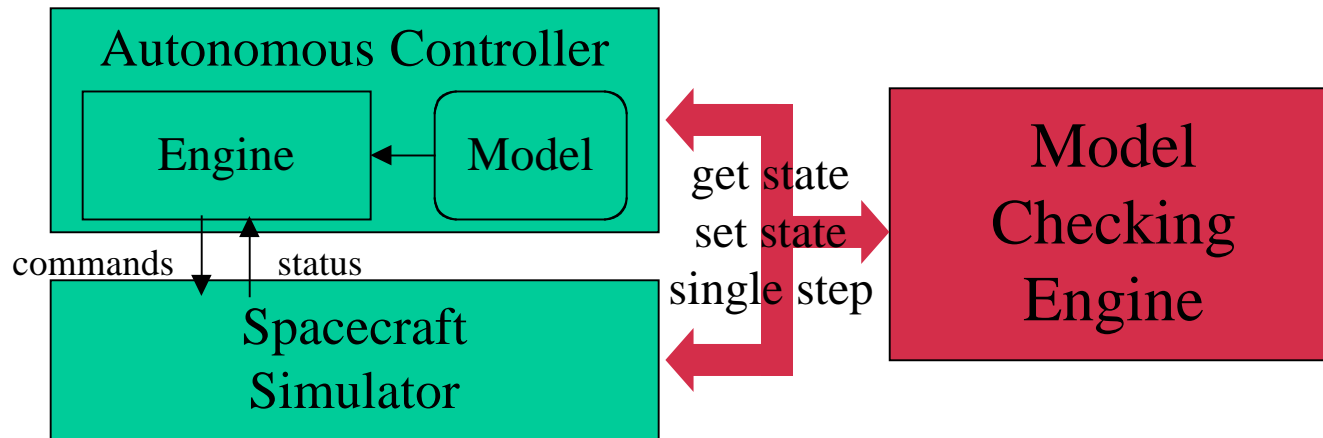
- 4K lines of Lisp
- Similar nature \Rightarrow translation is easy
- Properties in temporal logic + pre-defined patterns
- Pilot Application:
ISPP autonomous controller (KSC)
- In progress:
 - more property patterns
 - translate results back to Livingstone

Verification of Model-Based Systems



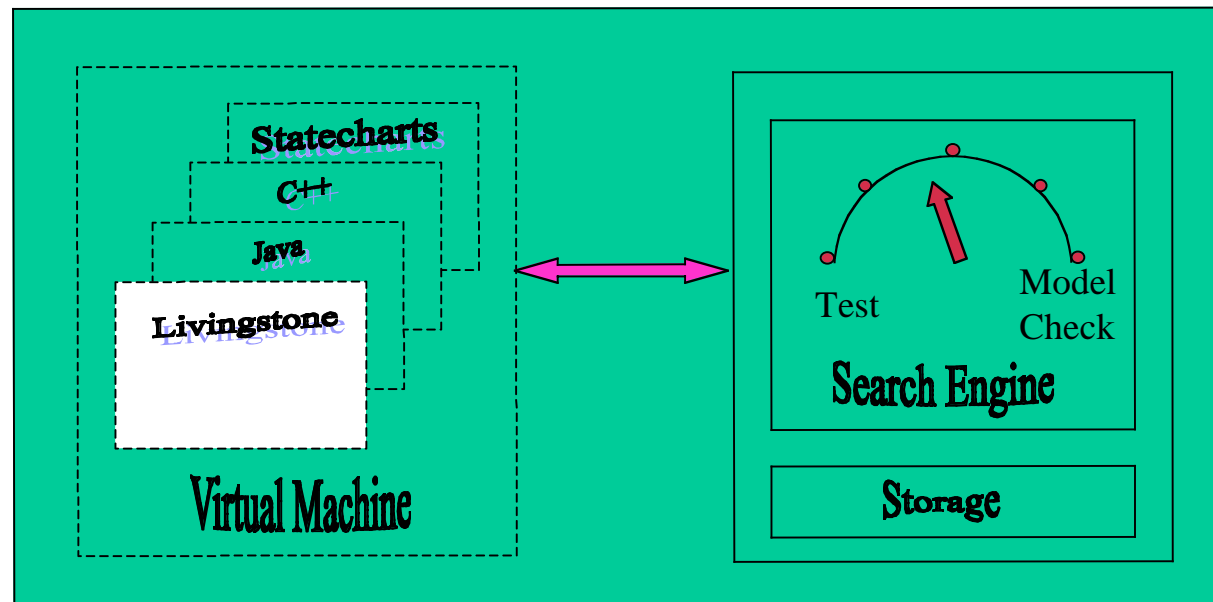
- Model-based **system** = engine + model
- correct engine + correct plan \neq good system !
e.g. can fail to properly recognize a fault
- Model check? Very hard!
Need (abstract) model of reasoning engine + model
 \Rightarrow complex, error-prone, huge state space

Analytic Testing



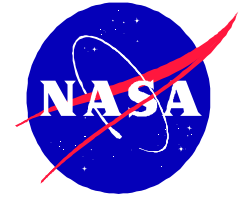
- Testing the real system => accuracy.
- Model-checking approach => exhaustive exploration.
- Restricted scenarios in simulator (otherwise too big).
- Completes, not supersedes, Model V&V (later stage).

Generic Verification Environment



- Principle: uncouple V&V subject from V&V algo.
- Common denominator of several projects in ASE.
- Hooks already present in Livingstone.

Conclusions



Model checking:

- Autonomy needs it – testing is not enough
- General pros&cons apply:
 - exhaustive... if model is small enough
 - automatic verification... but tough modeling
- Works nicely on autonomy models
- Solutions inbetween testing and model checking
- Not short of tough problems:
 - Real-time, hybrid, AI
 - Learning/adaptive systems: *after training/including training*

MPL to SMV: Example

Lisp shell

```
(load "mpl2smv.lisp")
;; load the translator
;; Livingstone not needed!
```

```
(translate "ispp.lisp" "ispp.smv")
;; do the translation
```

```
(smv "ispp.smv")
;; call SMV
;; (as a sub-process)
```

```
(defcomponent heater ...)
(defmodule valve-mod ...)
...
(defverify
 :structure (ispp)
 :specification (all (globally ...)))
```

ispp.lisp

```
MODULE Mheater ...
MODULE Mvalve-mod ...
...
MODULE main
VAR Xispp: Mispp
SPEC AG ...
```

ispp.smv

```
Specification AG ... is false as shown ...
State 1.1: ...
State 1.2: ...
```

SMV output