



# Branch & Bound with SPIN 4.0

AMETIST meeting, Dortmund  
Monday 2-Dec-2002

**Theo C. Ruys**  
University of Twente  
Formal Methods & Tools group  
<http://www.cs.utwente.nl/~ruys>



**Work in Progress**






University of Twente  
The Netherlands

and the  
Cybernetix  
Case Study


## Overview

- **Introduction**
- Model checking and scheduling problems
- Soldiers / **Hippies** problem
- **SPIN 4.0** – new features
- **Hippies** problem with **SPIN 4.0**
- **Cybernetix** case study with **SPIN 4.0**
- **Conclusions**




Mon 2-Dec-2002

Theo C. Ruys - Branch & Bound with SPIN 4.0




## Background

- **[Ruys & Brinksmas – TACAS 1998]**
  - introduces the soldiers problem
  - SPIN is used to solve this simple scheduling problem
- **SPIN Cookbook**
  - recipes for using SPIN in an effective way
  - “dessert” – Travelling Salesman Problem (Oct. 1999)
    - used the same approach as [Ruys & Brinksmas 1998]
    - exploited bitstate hashing to tackle “large” TSPs
- **AMETIST Meeting** (Sep. 2002)
  - Attempts to attack the “Cybernetix Case”, a typical job shop scheduling problem. — We had the feeling that we could do **better** with **SPIN**.



Mon 2-Dec-2002

Theo C. Ruys - Branch & Bound with SPIN 4.0



## What is Model Checking?

**Model M**

```

Syntax:
procspike App0 {
  ...
}
            
```

**Property  $\phi$**

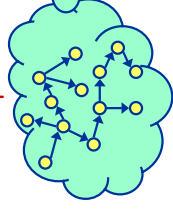
$\square (\pi < 3)$

**Model Checker**


**$M \models \phi$**

**YES,**  
property is  
satisfied

**NO,**  
+ trace to  
error




State Space



Mon 2-Dec-2002

Theo C. Ruys - Branch & Bound with SPIN 4.0



### SPIN - Introduction (1)

**SPIN** (= Simple Promela Interpreter)

- = is a tool for analysing the logical consistency of **concurrent systems**, specifically of data communication protocols.
- = **state-of-the-art** model checker, used by >2000 users
- concurrent systems are described in the modelling language called **Promela**.



Mon 2-Dec-2002

Theo C. Ruys - Branch & Bound with SPIN 4.0

5

University of Twente

### SPIN - Introduction (2)

- Promela** (= Protocol/Process Meta Language)
- specification language to model finite-state systems
  - loosely based on **CSP**
    - dynamic creation of **concurrent processes**
    - communication via **message channels** can be
      - synchronous (i.e. rendezvous), or
      - asynchronous (i.e. buffered)
  - features from Dijkstra's guarded command language
  - features from the programming language **C**

**Promela is a modelling language, not a programming language.**



Mon 2-Dec-2002

Theo C. Ruys - Branch & Bound with SPIN 4.0

6

University of Twente

### SPIN - Introduction (3)

- Major versions:

1.0	Jan 1991	initial version [Holzmann 1991]
2.0	Jan 1995	partial order reduction
3.0	Apr 1997	minimised automaton representation
4.0	late 2002	embedding of C code

- Some **success factors** of SPIN
  - "press on the button" verification (model checker)
  - very efficient implementation (using C)
  - nice graphical user interface (Xspin)
  - not just a research tool, but well supported
  - contains more than two decades research on advanced computer aided verification (many optimization algorithms)



2001  
Gerard Holzmann

1983 Unix  
1986 TeX  
1991 TCP/IP  
1997 Tcl/Tk



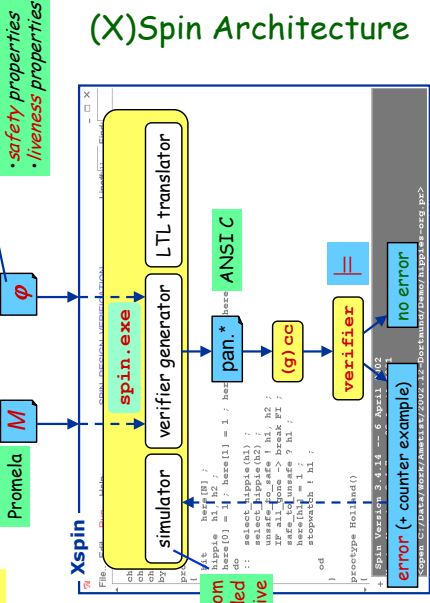
Mon 2-Dec-2002

Theo C. Ruys - Branch & Bound with SPIN 4.0

7

University of Twente

$M \models \varphi$



Mon 2-Dec-2002

Theo C. Ruys - Branch & Bound with SPIN 4.0

8

University of Twente

### Model checking "scheduling problems" (1)

- **M** = model of the problem in Promela
  - with **costs** (or **time**) added to states/transitions
  - a variable **cost** is updated when a transition is taken or a state is reached.
- **Goal**: find schedule to an end-state with **minimum cost**.
  1. Verify that **M** is error-free.
  2. Find optimal schedule:

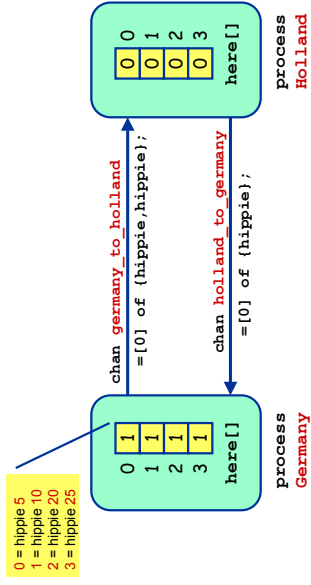
```

max := guess of (worst case) maximum cost
do
  verify M |= (<> cost > max)
  if (error)
  then max := cost
  while (error)
    
```

"eventually cost will be larger than max"

If there is a path to a final state for which the cost is less than max, SPIN will generate an error trail leading to this state.

### Modelling the "hippies" problem



It is clear that you want to send two hippies over to Holland but only one hippie back with the flashlight.

### DEMO

### Solution to the Hippies problem (1)

```

chan germany_to_holland = [0] of {hippie, hippie} ;
chan holland_to_germany = [0] of {hippie} ;
chan stopwatch = [0] of {hippie} ;
byte time ;
...
proctype Germany ()
{
  bit here[N] ;
  hippie h1, h2 ;
  here[0]=1; here[1]=1; here[2]=1; here[3]=1;
  do
    :: select hippie (h1) ;
       select hippie (h2) ;
       germany_to_holland ! h1, h2 ;
       IF all_gone -> break FI ;
       holland_to_germany ? h1 ;
       here[h1] = 1 ;
       stopwatch ! h1 ;
  od
}
    
```

the "cost"

Process "Holland" is the dual of "Germany".

A hippie is a byte.

A hippie is randomly chosen from the hippies that are still "here".

It can be modelled more effectively. See [Ruys 2001] for directions.

DEMO

## Solution to the Hippies problem (2)

Mon 2-Dec-2002    Theo C. Ruys - Branch & Bound with SPIN 4.0    13

```

proctype Timer ()
{
  end:
  do
  :: atomic { stopwatch ? 0 -> time=time+5 ; MSCTIME }
  :: atomic { stopwatch ? 1 -> time=time+10; MSCTIME }
  :: atomic { stopwatch ? 2 -> time=time+20; MSCTIME }
  :: atomic { stopwatch ? 3 -> time=time+25; MSCTIME }
  od
}

init {
  atomic { run Germany(); run Holland(); run Timer(); }
}
    
```

Now we should check:  
 $\diamond$  (time>60)

Mon 2-Dec-2002    Theo C. Ruys - Branch & Bound with SPIN 4.0    14

## Model checking "scheduling problems" (2)

Mon 2-Dec-2002    Theo C. Ruys - Branch & Bound with SPIN 4.0    14

- Idea of using model checkers for solving **scheduling problems** has been taken up. See for instance:
  - [Brinksma & Mader - SPIN 2000]
  - [Larsen et. al. - CAV 2001]
  - [Ansgar Fehnker - PhD Thesis 2002]
- Original idea works, but is **inefficient**:
  - the (initial) complete state space already contains the most optimal solution;
  - iteratively checking  $\diamond$  (cost > max) to obtain this solution is not needed, of course.

Model Checkers are being used for serious scheduling problems!

However, due to SPIN's **on-the-fly** model checking algorithm, for each subsequent iteration, **less of the state space** has to be checked: **SPIN stops** when it finds a state for which **cost>max** holds.

Mon 2-Dec-2002    Theo C. Ruys - Branch & Bound with SPIN 4.0    15

## Branch & Bound

Mon 2-Dec-2002    Theo C. Ruys - Branch & Bound with SPIN 4.0    15

- **Branch & Bound** (from "operations research", early sixties)
  - is an approach developed for **solving** discrete and combinatorial optimisation problems, especially integer programming problems
- **Idea**:
  - enumerate all possible solutions
  - represent these solutions by a directed graph/tree
    - leaves are end-points of possible solutions
    - a path from the starting node to a leaf represents a solution
  - while building the graph (= state space), we can **stop considering** the descendants of an interior node, if
    - it is certain that all paths via this node will lead to an **invalid** path, or
    - it is certain that all paths via this node will have **higher cost** than the best path found so far.

The branch-and-bound approach is **not a heuristic**, or approximating procedure, but it is an **exact, optimising procedure** that finds an **optimal solution**.

Mon 2-Dec-2002    Theo C. Ruys - Branch & Bound with SPIN 4.0    16

## SPIN 3.x

Mon 2-Dec-2002    Theo C. Ruys - Branch & Bound with SPIN 4.0    16

- If we could make the **best cost** "global" to all execution paths, we could **update** this best cost each time we find a better one.
- **Sketch** to find an **optimal schedule** in SPIN version 3.x:
  - Add a **global variable** `best_sofar` to `pan.c` that is global for all verification runs.
  - Everytime a correct schedule is found of which the cost is lower, the variable `best_sofar` is **updated** and the **trail leading to this schedule is saved**.
  - The variable `best_sofar` will **not be part of the state vector**, but will be global to the verification.
  - The variable `best_sofar` is **initialised in a special section** before the verification is started.


**Drawback**: we have to **change the source code of SPIN**.

Mon 2-Dec-2002    Theo C. Ruys - Branch & Bound with SPIN 4.0    17

## SPIN 4.0 (1)

Alpha version of SPIN 4:  
<http://spinroot.com>

- **SPIN 4.0** supports the inclusion of embedded C code into Promela models. Five new primitives:
  - `c_decl { ... }` to introduce C types that can be used in the Promela model
  - `c_state ...` to add new C variables: Global, Local or Hidden
  - `c_expr { ... }` to execute a C expression and use the return value in the model
  - `c_code { ... }` to add atomic C statements to the model (e.g. printing)
  - `c_track { ... }` can be used to track memory, holding state information




Mon 2-Dec-2002  
Theo C. Ruys - Branch & Bound with SPIN 4.0  
17  
University of Twente

## SPIN 4.0 (2)

- The purpose of the new primitives is to provide support for **automatic model extraction** from C code.
  - to build your “own” FeaVer [Holzmann 2000].
- ... “The capability to embed arbitrary fragments of C code into a Promela model is **very powerful** and therefore **easily misused**” ...

But we can safely use it to find the **optimal solution** for a **scheduling problem**, like the “hippies” problem.

Another feature of SPIN 4.0: `pan` now has a “guided simulation” mode. It is not longer needed to replay the simulation with `spin`.



Mon 2-Dec-2002  
Theo C. Ruys - Branch & Bound with SPIN 4.0  
18  
University of Twente

## hippies-o1.pr

**DEMO**

```


proctype Holland()
{
  bit here[N] ;
  hippie h1, h2 ;
  do
  :: unsafe_to_safe ? h1, h2 ;
  here[h1] = 1 ;
  here[h2] = 1 ;
  stopwatch ! max(h1, h2) ;
  IF all here -> break FI ;
  select_hippie(h1) ;
  safe_to_unsafe ! h1 ;
  od ;
  c_code {
    printf("found another schedule: %d\n", now.time) ;
  }
}

```

Just printing the time of the schedules found.

**"now"** is the current state; we can access the global and local variables in this state.

we can even save the schedules by calling `pan's puttrail()`



Mon 2-Dec-2002  
Theo C. Ruys - Branch & Bound with SPIN 4.0  
19  
University of Twente

## hippies-o2.pr

**DEMO**

- In the declaration part of the Promela file:
 

```

#define MAX_TIME 1000
c_state "int best_time" "Hidden"

```

This declaration is copied verbatim to `pan.c`.
- At the end of the **Holland** proctype (i.e. in the final state of a possible schedule):
 

```

c_code {
  if (now.time < best_time) {
    best_time = now.time;
    printf("> best time now: %d\n", best_time);
    puttrail();
    Nr_Trails--; /* Only save the best trail */
  }
}

```


The variable “now” corresponds with the current state.

`puttrail` and `Nr_Trails` are globals of `pan.c`.
- Initialise `best_time` in `init`:
 

```

c_code { best_time = MAX_TIME; };

```



Mon 2-Dec-2002  
Theo C. Ruys - Branch & Bound with SPIN 4.0  
20  
University of Twente

**DEMO** hippies-o3.pr (1)

- Simple **optimisation**:
  - if after the "stopwatch has been pressed", the **time** is **already greater** than **best\_time**, we know that this execution trace will not lead to a better trace. So, we stop searching the state space.
- In the **Germany** proctype:
 

```

stopwatch ! h1 ;
IF c_expr { (now.time > best_time) } -> break FI;
            
```
- In the **Holland** proctype:
 

```

...
stopwatch ! max(h1, h2) ;
IF c_expr { (now.time > best_time) } -> break FI;
            
```

**Beware!** we are now changing the model; **invalid end-states** will get introduced!

Optimisation: simple (branch &) bound.

21  
University of Twente

**DEMO** hippies-o3.pr (2)

The complete **Holland** proctype would then become:

```

proctype Holland()
{
  bit here[N] ;
  hippie h1, h2 ;
  do
  :: unsafe to safe ? h1, h2 ;
  here[h1] = 1 ;
  here[h2] = 1 ;
  stopwatch ! max(h1, h2) ;
  IF c_expr { (now.time > best_time) } -> break FI ;
  IF all here -> break FI ;
  select_hippie(h1) ;
  safe_to_unsafe ! h1
od ;
}
            
```

Optimisation: simple (branch &) bound.

22  
University of Twente

**DEMO** hippies-o4.pr

- Branch & bound in **never claim**:
  - Instead of pruning the search tree in the Promela model, we can also limit the search of the state space via a **never claim** (i.e. combination with original idea).
- We **on-the-fly** check  $\langle \> (now.time \geq best\_time)$ :
 

```

#define higher_cost (c_expr { now.time >= best_time })
never { /* !< higher_cost */
  skip; /* skip over c_code { best_time ... } of Init */
}
accept init:
  r0_init:
  :: (! (higher_cost)) -> goto r0_init
  fi;
}
            
```

Note that the **property** we are checking is **altered** during the verification.

**SPIN** verifies a **TL formula** using a **never claim**, that is **automatically generated** from the **formula**.

Optimisation: (branch &) bound in **never claim**.

23  
University of Twente

**Hippies - results**

filename	description	# states
original	deadlock checking	2541
original	$\langle \> (time \geq 60)$	1325
hippies-o1	just print all schedules found	2659
hippies-o2	saving the best schedule	2630
hippies-o3	branch & bound in processes	1766
hippies-o4	branch & bound in never claim	1330

Note: The max value is not known, typically.

24  
University of Twente

### Summary (so far)

- With **SPIN 4.0**, we can now influence the traversal of the state space (i.e. the verification):
  - in the Promela model
  - but (even more conveniently) in the property
- ... and for debugging purposes we can now also add **printf**-statements to the verification process.



Mon 2-Dec-2002

Theo C. Ruys - Branch & Bound with SPIN 4.0



25

University of Twente

### Cybernetix Case Study

- **Smart Card Personalisation Machine:**
  - takes a pile of the blank smart cards
  - programs them with the personalised data
  - prints them and
  - tests them
- **Order** of the original cards should be **preserved**.
- **Objectives** of the case study
  - synthesis of correct and optimal schedules.
  - come up with a general model and tool for Cybernetix.



Mon 2-Dec-2002

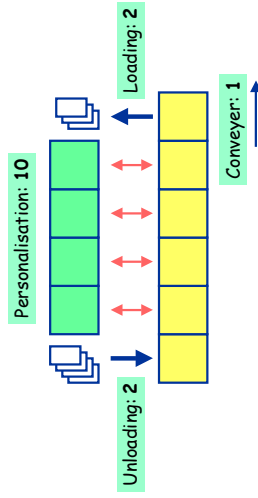
Theo C. Ruys - Branch & Bound with SPIN 4.0



26

University of Twente

### Model of the Personalisation Machine



- **Constraints / Assumptions:**
  - The Conveyor cannot move during Unloading and Loading.
  - Starting the Personalisation is instant.
- **Parameters:**
  - NPERs: number of stations
  - NCARDS: number of cards



Mon 2-Dec-2002

Theo C. Ruys - Branch & Bound with SPIN 4.0



27

University of Twente

### Cybernetix Model in SPIN (1)

initial model based on the Uppaal model of [Krihavičius & Usenko]

```

Global variables:
short belt[NCELLS]; /* conveyor_belt */

NCELLS == NPERS+2

belt[i] == 0: slot on belt is empty
belt[i] > 0: card is not yet personalised
belt[i] < 0: card is already personalised

short time; /* time elapsed */

The Conveyor, Unloader and Loader processes
update the time; the Pers(onalization) process
waits till the time has elapsed.
    
```



Mon 2-Dec-2002

Theo C. Ruys - Branch & Bound with SPIN 4.0



28

University of Twente

### Cybernetix Model in SPIN (2)

```

proctype Unloader () {
  /* Unloads a card onto the conveyor belt. */
  short nextCard = 1; /* next card to be put onto the belt */
  do
  :: d_step { (nextCard <= NCARDS) && (belt[0] == EMPTY) ->
    belt[0] = nextCard;
    nextCard = nextCard+1;
    time = time + TUNLOAD;
    printf("> Unloader (time + %d => %d)\n", TUNLOAD, time);
    PRINT_BELT;
  }
  od
}

```

Only present for visualizing a schedule found; these print-statements will not be executed during the verification.



Mon 2-Dec-2002

Theo C. Ruys - Branch & Bound with SPIN 4.0

29

University of Twente

### Cybernetix Model in SPIN (3)

```

proctype Pers (int i) {
  short card, finish_time;
  do
  :: d_step { (belt[i] > 0) ->
    card = belt[i];
    belt[i] = EMPTY;
    finish_time = time + tPERSONALISE;
    printf("> Pers, station %d STARTED: card %d (time now: %d) \n",
      i, card, time);
    PRINT_BELT;
  }
  d_step { (finish_time <= time) && (belt[i] == EMPTY) ->
    belt[i] = -card;
    finish_time = 0;
    printf("> Pers, station %d ENDED: card %d (time now: %d) \n",
      i, card, time);
    PRINT_BELT;
  }
  od
}

```

Pers (i) waits till the time has elapsed and it can place the personalised card back onto the belt.

To allow more optimisations, in the current model, these variables are now global.



Mon 2-Dec-2002

Theo C. Ruys - Branch & Bound with SPIN 4.0

30

University of Twente

### Cybernetix Model in SPIN (4)

We also need a process to "tick" away the time for the personalisation stations. In other words: the conveyor and unloader/loader sometimes have to wait for a personalisation station to be finished.

```

#define MAX_TICKS 30
proctype Tick () {
  byte n;
  do
  :: d_step { (n < MAX_TICKS) ->
    time = time + 1;
    n = n + 1;
    printf("> Tick 1 (%d)\n", time);
  }
  :: else -> break
  od
}

```



Mon 2-Dec-2002

Theo C. Ruys - Branch & Bound with SPIN 4.0

31

University of Twente

### Cybernetix Model in SPIN (5)

- This first, naive model did work, but was not efficient enough.
  - With SPIN we (roughly) got the same results as [Krilavicius & Usenko].
- First (obvious) improvements:
  - Unloading & loading can happen at the same time, so both processes should be merged.
  - Using **d\_step**'s instead of **atomic**'s.
  - Resetting all local variables to zero after using them in a computation.



Mon 2-Dec-2002

Theo C. Ruys - Branch & Bound with SPIN 4.0

32

University of Twente



## Optimisations

- Optimisations in the model:
  - (++) **TimeAdvance()** instead of **ticks()**
    - Following [Brinkma & Mader, 2000], we let the **time** jump to the next moment in time when a new personalised card is ready.
  - (+) Changing the **scheduling** of the processes such that a (semi) optimal schedule is found fast.
  - (+) Only allowing **Personalisation** to start directly after a Conveyor move.
- **Bounding the search:**
  - (+) **Bounding the search on incorrect schedules.**
  - (++) Check if the **minimum finish time** for the last card (i) in the unloader, (ii) on the belt or (iii) in a personalisation station is already **greater** than the **best\_time** so far.



## DEMO

### Cybernetix - DEMO

**NPERS=4 NCARDS=5**

```

[ 0, 0, 0, 0, 0, 0 ]
[ 0, 0, 0, 0, 0, 0 ]
[ 1, 0, 0, 0, 0, 0 ]
[ 1, 0, 0, 0, 0, 0 ]
[ 0, 0, 0, 0, 0, 0 ]
[ 0, 1, 0, 0, 0, 0 ]
[ 0, 0, 0, 0, 0, 0 ]
[ 2, 0, 0, 0, 0, 0 ]
[ 1, 1, 0, 0, 0, 0 ]
[ 1, 0, 0, 0, 0, 0 ]
[ 0, 1, 2, 0, 0, 0 ]
[ 0, 1, 0, 0, 0, 0 ]
[ 1, 1, 2, 0, 0, 0 ]
[ 0, 1, 2, 0, 0, 0 ]
[ 0, 0, 3, 0, 0, 0 ]
[ 1, 1, 2, 0, 0 ]
    
```



## Bounding the search

- All **bound optimisations** are taken care of in the never claim:

```

#define higher_cost (c_expr {
(now.time >= best_time) ||
(now.time < 0) ||
(will_not_be_faster()) ||
(! schedule_ok())
})

never { /* !<> higher cost */
skip; /* skip over 1st step of the init-process */
accept_init:
T0_init:
if
fi;
fi;
}

will_not_be_faster() and
schedule_ok() are ordinary
C-functions that use the
current state "now" and
the best_time.
    
```



## Some observations

- The **state space** is more breadth than deep!
- Due to SPIN's state matching, SPIN will always find **only one optimal schedule!**
  - An extra variable in each state is needed to make it unique.
- If the **personalisation time** is **low** w.r.t. the number of stations, the optimal schedule will **not use all** personalisation stations.
  - Example: **NPERS=4 NCARDS=4 tPERSONALISE=5**
    - 108 different schedules that need 27 time units.
    - Only a single one for the optimal schedule in 26 time units.
    - 55x10<sup>4</sup> states to find all possible schedules (only 2x10<sup>4</sup> to find the optimal one)
    - The optimal schedule only uses two of the personalisation stations.



## Effectiveness of optimisations

NPERS=4 NCARDS=4  
SPIN: -DBITSTATE

	# states	# secs
V1 initial model using Tick()	46325800	1080.8
V2 = V1 + TimeAdvance()	2364370	49.5
V3 = V2 + better scheduling of procs	1739010	34.9
V4 = V3 + <> ..    ! schedule_ok()	1345000	26.2
V5 = V3 + <> ..    will_be_too_late()	93199	2.2
V6 = V4 + V5	65999	1.6
V7 = V6 + get all schedules (+ magic number)	953866	15.7



Mon 2-Dec-2002

Theo C. Ruys - Branch & Bound with SPIN 4.0

37  
University of Twente

## Comparison with [Krilavičius & Usenko]

"standard" Uppaal (Spring 2002) – no cost-reward

[Krilavičius & Usenko] Uppaal 2k  
Sun/Solaris: 1Gb RAM

vs.

SPIN 4.0α, P3 Mobile/1 Ghz  
Windows 2000, 256Mb RAM

-DBITSTATE

Cards Stations (4 cells)	2	3	4	5	6	7	8	9
2	20	28	32	39	43	50	54	61 251245 4.1 sec
3 (5 cells)	21	25	30	34	38	42 579097 8.8 sec	47 1.9 x 10 <sup>6</sup> 30 sec	51 3.7 x 10 <sup>6</sup> 59 sec
4 (6 cells)	22	27	30	35	39 3.6 x 10 <sup>6</sup> 64 sec	43 13 x 10 <sup>6</sup> 231 sec	47 34 x 10 <sup>6</sup> 635 sec	50 56 x 10 <sup>7</sup> 1057 s.

SPIN 4.0 computed optimal schedules for all entries in the 2-4 x 2-9 table within 36 minutes.

Mon 2-Dec-2002



Theo C. Ruys - Branch & Bound with SPIN 4.0

38  
University of Twente

## Comparison with Uppaal

- Compared to the timed-approach of [Krilavičius & Usenko] with standard Uppaal, the **tuned approach** with SPIN
  - performs (much) **better**
  - could even **be better** if we would use the time of the optimal schedule (super single mode) to find the schedule
- Disadvantages/advantages** of using SPIN:
  - you have to add time yourself
  - more information on and during the verification process
  - more ways to "guide" the search
  - possible to get all possible schedules (as "error" trails)
  - SPIN's optimisation options, e.g. bitstate hashing
- What about a "special purpose cost/reward SPIN"?
  - This could be as expensive as the "magic number" trick to get all possible schedules.



Mon 2-Dec-2002

Theo C. Ruys - Branch & Bound with SPIN 4.0

39  
University of Twente

## Discussion

- Job-shop **scheduling** (and TSP) is **NP-complete**.
  - The MC-approach (even with branch-and-bound) seems counter intuitive.
    - the state space is enormous, but still we set out to generate (part of) this state space
  - Does the MC-approach **scale up**?
    - TSP problems fail around N=20
    - Cybernetix case study: only toy-parameters
  - Approximation algorithms** for NP-hard problems
    - try to find a "good" solution as soon as possible
    - improve the solution locally
    - does not guarantee to find the "optimal" solution
  - The MC-approach might **not** always give an answer....



Mon 2-Dec-2002

Theo C. Ruys - Branch & Bound with SPIN 4.0

40  
University of Twente

## Conclusions

- However, the **MC-approach** is still **appealing**:
  - Use the model checker to **verify** that the formalisation of the problem is **correct**.
  - Use the model checker to generate an (optimal) **solution** to the problem.
- **SPIN 4.0** offers nice features to implement the Branch & Bound approach on the Promela level.
  - Branch & Bound functionality can nicely be **isolated** in the  $\diamond$ -property (i.e. the never claim).
    - which is also less costly than implementing it in the model
- **SPIN 4.0** seems to outperform “standard” UPPAAL for discrete-time scheduling problems.



Mon 2-Dec-2002

Theo C. Ruys - Branch & Bound with SPIN 4.0

41

University of Twente

## Future work

- **Improvements** of the Cybernetix model:
  - trying to decide earlier on non-valid schedules;
  - even better “bound” functions (e.g. using the known optimal times for sub-problems);
  - garbage collection of the state space after finding new optimal solutions;
- **Future directions**:
  - add defective cards
  - add flip-over stations
  - checking the “optimal cycle” in the schedule
  - alternative architecture of machine [Angelika Mader]



Mon 2-Dec-2002

Theo C. Ruys - Branch & Bound with SPIN 4.0

42

University of Twente