

# Open-source Quality Assurance and Performance Analysis Tools

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Inform's Annual Meeting 2008  
Washington DC

# Agenda

- Motivation
- Definitions and Components
- Challenges
- Software Quality Assurance at GAMS
- Testing new Solver Links
- Performance Analysis
- Summary

## Quality Assurance

- Essential component in most industries
- Important in most software engineering sectors

## Mathematical Programming

- Less attention to quality assurance (small community)
- Specific QA issues for modeling systems (initially expensive)
- Different focus for industry and academic



# Definitions

**Quality:** *The totality of features and characteristics of a product or service that bear on its ability to satisfy specified or implied needs (ISO 8402)*

**Software Quality Assurance (SQA):** *“Set of systematic activities providing evidence of the ability of the software process to produce a software product that is fit to use” (Schulmeyer and McManus)*

# Definitions

cont'd

**Key components of SQA** (which includes monitoring of *products* and *processes*):

- Software configuration management (SCM): All activities related to version control and change control
- Quality control and testing: monitoring the products
  - Focus on the quality of product within each phase of the software development lifecycle
  - Objective: identify and remove defects throughout the lifecycle, as early as possible

# Components

**Software configuration management:** All activities related to version control and change control

## Goals:

- Identify and control changes
- Ensure that change is being properly implemented
- Report changes in the software to others who may need to know of them

# Components

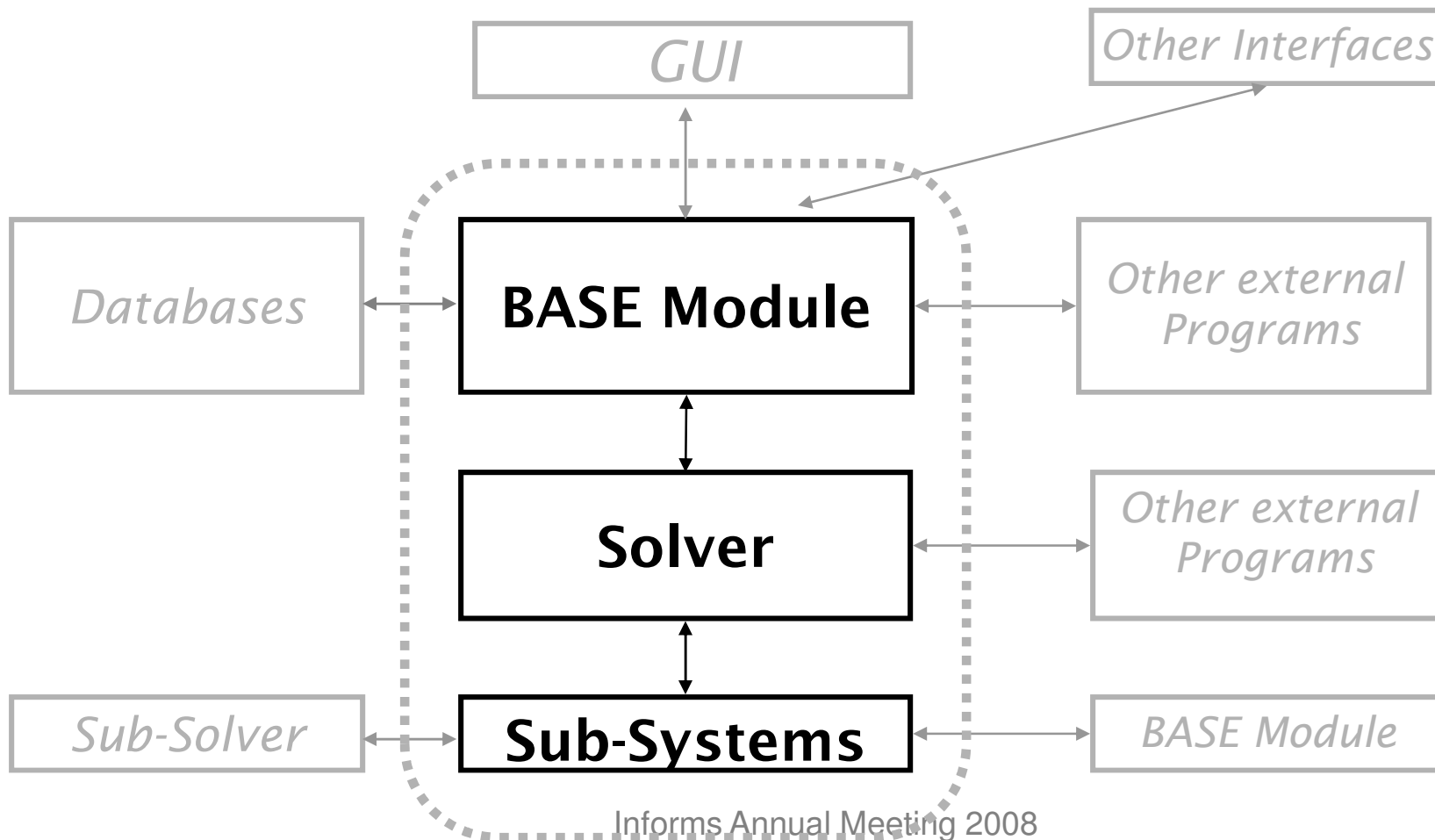
## Quality control and testing of the product

- Unit testing (initial tests by developer)
- Regression testing (interaction with other modules)
- System Integration Testing (full scale testing)
- Metrics
- Bug tracking tools

**Goal:** Uncover defects during the complete life cycle of the software as *early as possible*

# Algebraic Modeling Systems

## Architecture



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# Algebraic Modeling Systems

## Basic Principles

- Separation of model and solution methods
- Balanced mix of declarative and procedural approaches
- Computing platform independence
- Multiple model types, solvers and platforms

# Algebraic Modeling Systems

## Multiple Model Types

- LP Linear Programming
- MIP Mixed Integer Programming
- NLP Nonlinear Programming
- QCP/MIQCP Quadratic Programming
- Conic Programming
- MCP Mixed Complementarity Programming
- MINLP Mixed Integer Nonlinear Programming
- MPEC NLP with Complementarity Constraints
- MPSGE General Equilibrium Models
- Stochastic Optimization
- Global Optimization

# Challenges

- **Expense:** Rigorous SQA is initially expensive
  - MP industry is small
- **Limited control** about certain parts of the system
  - solvers are black box modules
- **Distributed development** of the system and various components

# Challenges: Chance of Failure

## QA issues specific to Mathematical Programming Software:



# Implementation Defect

```

*** STOP: 0x00000019 (0x00000000,0xC00E0FF0,0xFFFFEFD4,0xC0000000)
BAD_POOL_HEADER

CPUID: GenuineIntel 5.2.c irq:1f SYSVER 0xf0000565

Dll Base DateStmp - Name Dll Base DateStmp - Name
80100000 3202c07e - ntoskrnl.exe 80010000 31ee6c52 - hal.dll
80001000 31ed06b4 - atapi.sys 80006000 31ec6c74 - SCSIPTO.SYS
802c6000 31ed06bf - aic78xx.sys 802cd000 31ed237c - Disk.sys
802d1000 31ec6c7a - CLASS2.SYS 8037c000 31eed0a7 - Ntfs.sys
fc698000 31ec6c7d - Floppy.SYS fc6a8000 31ec6ca1 - Cdrom.SYS
fc90a000 31ec6df7 - Fs_Rec.SYS fc9c9000 31ec6c99 - Null.SYS
fc864000 31ed868b - KSecDD.SYS fc9ca000 31ec6c78 - Beep.SYS
fc6d8000 31ec6c90 - i8042prt.sys fc86c000 31ec6c97 - mouclass.sys
fc874000 31ec6c94 - kbdclass.sys fc6f0000 31f50722 - VIDEOPTO.SYS
feffa000 31ec6c62 - mga_mil.sys fc890000 31ec6c6d - vga.sys
fc708000 31ec6ccb - Msfs.SYS fc4b0000 31ec6cc7 - Npfs.SYS
fefbc000 31eed262 - NDIS.SYS a0000000 31f954f7 - win32k.sys
fefa4000 31f91a51 - mga.dll fec31000 31eedd07 - Fastfat.SYS
feb8c000 31ec6e6c - TDI.SYS feaf0000 31ed0754 - nbfs.sys
feacf000 31f130a7 - tcpip.sys feab3000 31f50a65 - netbt.sys
fc550000 31601a30 - el59x.sys fc560000 31f8f864 - afd.sys
fc718000 31ec6e7a - netbios.sys fc858000 31ec6c9b - Parport.sys
fc870000 31ec6c9b - Parallel.SYS fc954000 31ec6c9d - ParVdm.SYS
fc5b0000 31ec6cb1 - Serial.SYS fea4c000 31f5003b - rdr.sys
fea3b000 31f7a1ba - mup.sys fe9da000 32031abe - srv.sys

Address dword dump Build [1381] - Name
fec32d84 80143e00 80143e00 80144000 ffdff000 00070b02 - KSecDD.SYS
801471c8 80144000 80144000 ffdff000 c03000b0 00000001 - ntoskrnl.exe
801471dc 80122000 f0003fe0 f030eee0 e133c4b4 e133cd40 - ntoskrnl.exe
80147304 803023f0 0000023c 00000034 00000000 00000000 - ntoskrnl.exe

Restart and set the recovery options in the system control panel
or the /CRASHDEBUG system start option.

```

Blue Screen of  
Death in  
Microsoft  
Windows NT

Not  
acceptable

# Solver Failure

Solver does  
not find a  
solution

**Acceptable**

## S O L V E                      S U M M A R Y

MODEL	one	OBJECTIVE	output
TYPE	NLP	DIRECTION	MAXIMIZE

<b>**** SOLVER STATUS</b>	<b>4 TERMINATED BY SOLVER</b>
<b>**** MODEL STATUS</b>	<b>6 INTERMEDIATE INFEASIBLE</b>
**** OBJECTIVE VALUE	948403.4844

RESOURCE USAGE, LIMIT	1.906	1000.000
ITERATION COUNT, LIMIT	0	10000
EVALUATION ERRORS	0	0

# Challenges: Chance of Failure

## QA issues specific to Modeling Systems:



- Additionally, must protect the user in case of solver failure
- Complex metric for return codes is necessary
- Complicates QA activities since this adds an additional level of complexity

# SQA at GAMS

1. *Software configuration management*
2. **Quality control and tests of the product**
3. *Client model testing*
4. **Performance comparison tools**
5. *Solution verification tool: Examiner*
6. *Model converter and “encryption“ tool: Convert*



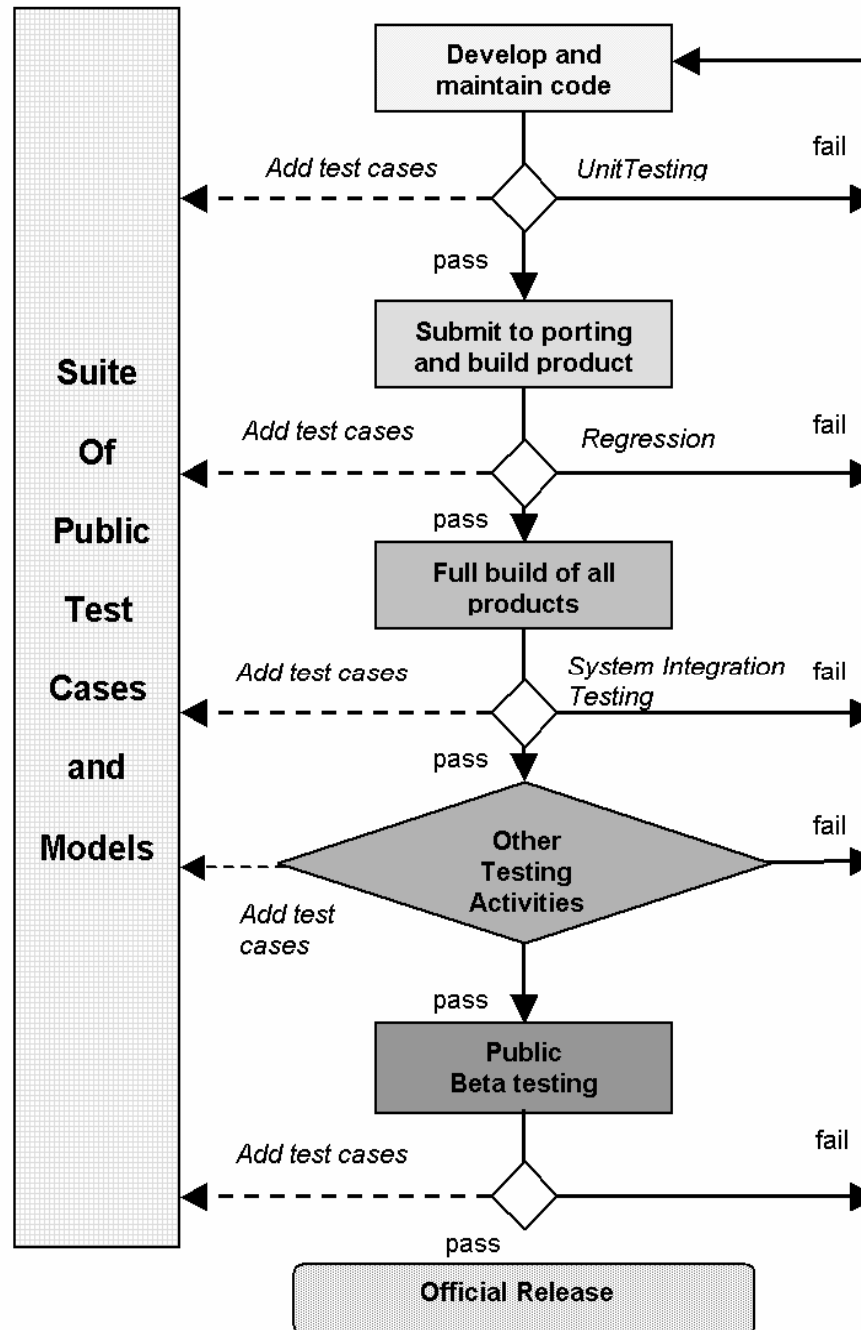
# SQA at GAMS (Testing)

## **Quality control and tests of the product**

- Goal: Continuous quality improvement using automated and reproducible tests
- Test libraries (available online):
  - GAMS Model Library (solver tests)
  - GAMS Quality Test Models Library (modeling system test)
- Continuous addition of new test models



# General testing process



Continuous addition of **new test models** throughout life cycle



## Quality Test Models Library

- Include tests to verify proper behavior of the system
- More than 400 quality test models, each containing numerous pass/fail tests:
  - ...
  - ```
abort$card(delta) 'time routines have an error';
```
  - ...
- Automatic generated test summaries with different level of information

## Summary of two quality runs

```
*** Status: Normal completion
--- quality.gms(284) 4 Mb
--- quality.gms(287) 4 Mb 1 Error
There were errors: 4 out of 408 tests failed.
See the file failures.gms to reproduce the failed runs
--- Putfile this D:\support\testlib\onetest.gms
--- quality.gms(287) 4 Mb 1 Error
*** Status: Execution error(s)
```

=====

```
*** Status: Normal completion
--- quality.gms(284) 4 Mb
--- quality.gms(295) 4 Mb
Congratulations! All 408 tests passed.
See the file alltests.gms to reproduce all the runs
--- Putfile this D:\support\testlib\onetest.gms
*** Status: Normal completion
```

# Testing New Solver Links

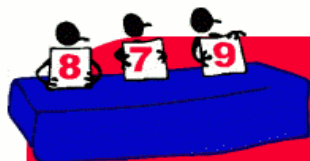
Solver developer has connected his solver to GAMS (e.g. a COIN solver)

- Automated tests to check basic functionality of the solver and the link to GAMS:

```
$title Simple level and sign test (LP02,SEQ=67)
* In this test series we status if a solver gets the levels
* and marginals right.
..
abort$( abs(cost.m-cost_m) > tol) 'bad cost.m';
```

- Gives developer and users assurance about the basic functionality of the link and the solver

# Performance World



## Performance World

### Welcome to the Performance World!

Performance World is a forum for discussion and dissemination of information and tools about all aspects of performance testing of solvers for mathematical programming problems. This world has been established in response to user demands for independent and reproducible performance results.

Overall performance highly depends on problem formulation, solver, and tuning parameters. Our performance tools are designed to serve the different needs of our user community. One user may be interested in finding the most reliable way to solve a proprietary or classified model. On the other hand, an academic researcher may be interested in testing a new algorithm against a set of existing test problems and competing approaches. The main features are:

- Uniform access to a comprehensive set of established and new test problems
- Automation tools for collecting performance measurements
- Tools for analyzing and visualizing test results

#### What's New:

- Try our online [PAVER Server](#) for automated performance analysis and visualization, batch file creation and model translation
- New tools for [analyzing non-convex or discrete models](#)
- MINLP type models from the [MINLP World](#) have been added to the [PerformanceLib](#)

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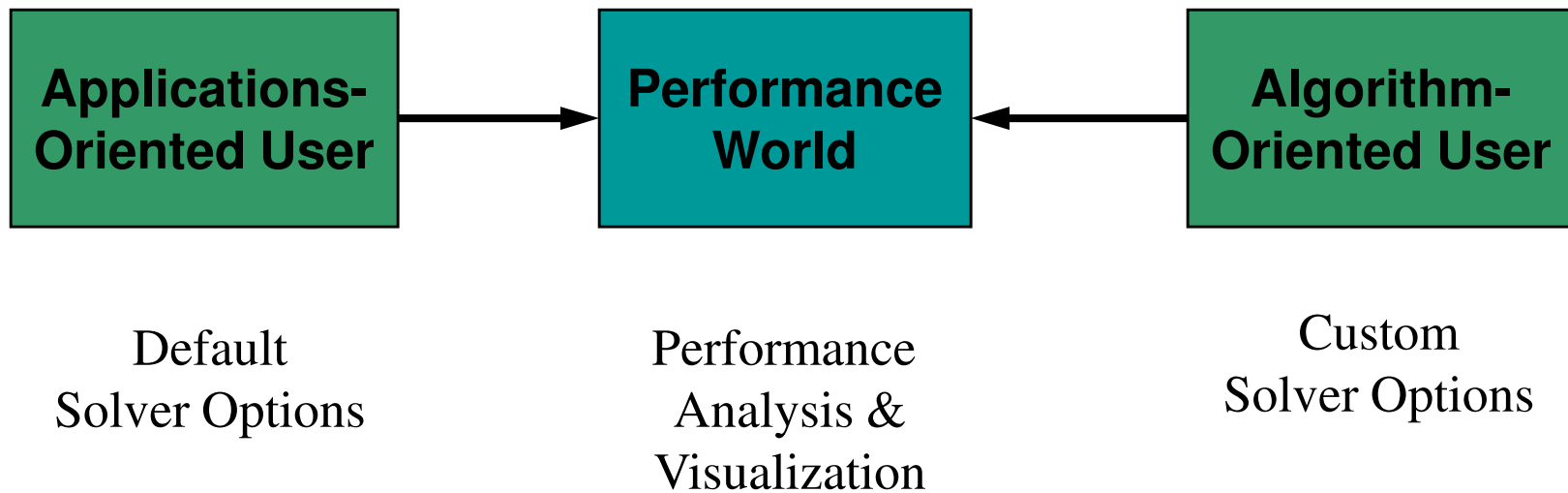
[Contact](#)

# Motivation for Tools

Performance Tools driven by user needs:

- Finding the most reliable way to solve a proprietary model
- Testing a new algorithm against a set of existing test problems and competing approaches
- Reproducibility of performance results

# Performance World



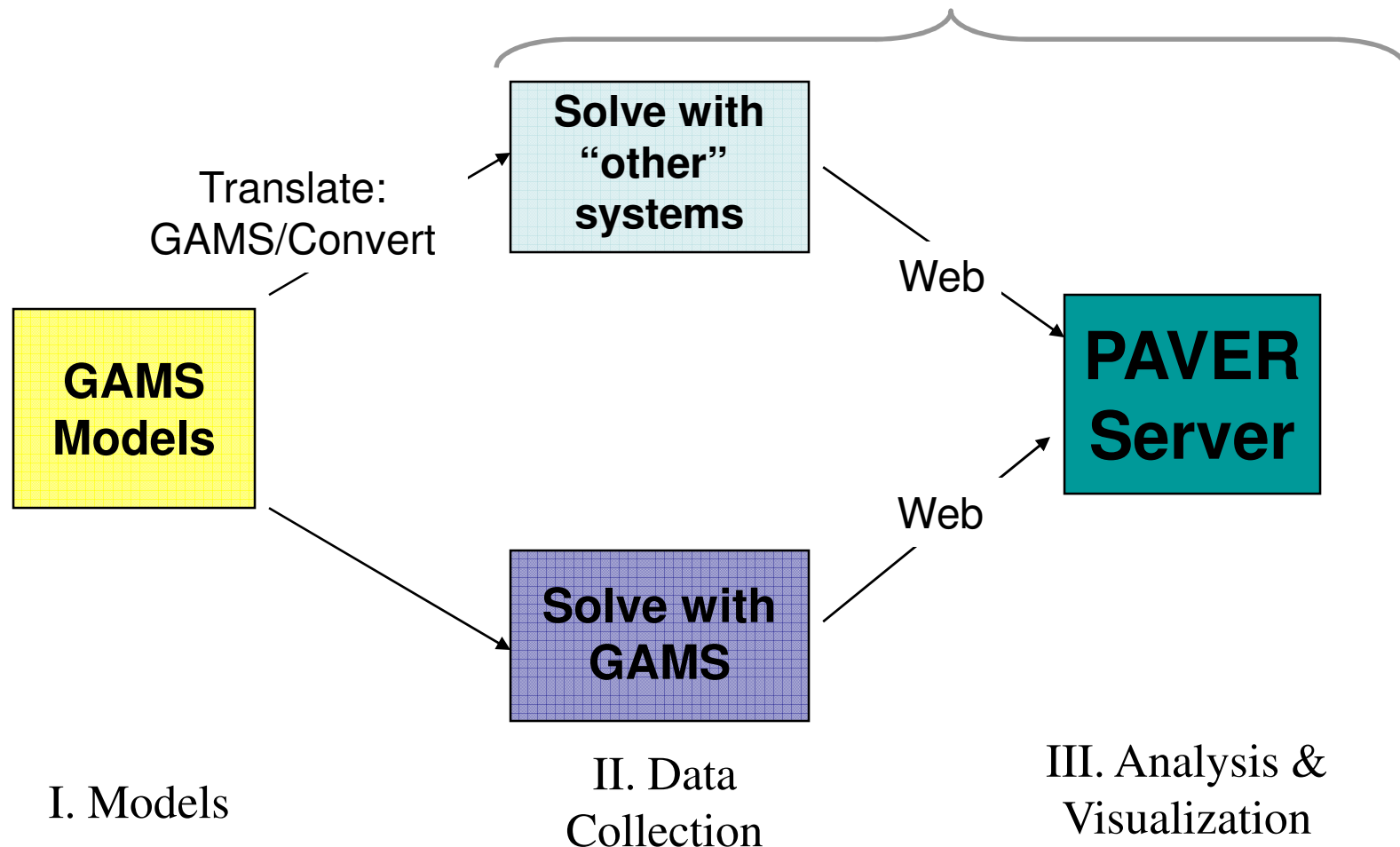


# Tools: Performance Analysis

- Different objectives:
  - Solver robustness and correctness
  - Solver efficiency
  - Quality of solution (nonconvex and discrete models )
- Tools are GAMS independent
- Results in HTML format: platform independent

# Performance Framework

Can use Performance World tools



# PAVER Server

- PAVER Server (**P**erformance **A**nalysis and **V**isualization for **E**ffortless **R**eproducibility)

[www.gamsworld.org/performance/paver](http://www.gamsworld.org/performance/paver)

- Online server to facilitate performance analysis/visualization of data
- Results sent via e-mail in HTML format
- Rely on 3 tools: resource time, solver square, performance profiles

# Tools: Robustness

## Solver Square Utility:

- Cross comparison of solver outcomes of two solvers:
  - Optimal, feasible, unbounded, infeasible, fail
- Compact tabular form for results
- Shows resource time and objective value information

→ Can use online using PAVER

Resource Time Comparison - All Models - Netscape 6

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|                       |                       |
|-----------------------|-----------------------|
| <b>Tracefile 1 :</b>  | <a href="#">A.trc</a> |
| <b>Tracefile 2 :</b>  | <a href="#">B.trc</a> |
| <b>Solvers used :</b> | Solver A              |
|                       | Solver B              |
| <b>Modeltype(s)</b>   | MINLP                 |

|                                          | Total              | Obj Solver A better | Obj same           | Obj Solver B better |
|------------------------------------------|--------------------|---------------------|--------------------|---------------------|
| Solver Solver A infinitely faster :      | <a href="#">4</a>  | <a href="#">4</a>   | -                  | -                   |
| Solver Solver A much faster :            | <a href="#">13</a> | <a href="#">1</a>   | <a href="#">4</a>  | <a href="#">8</a>   |
| Solver Solver A faster :                 | <a href="#">1</a>  | -                   | <a href="#">1</a>  | -                   |
| Solvers perform the same :               | <a href="#">10</a> | -                   | <a href="#">7</a>  | <a href="#">3</a>   |
| Solver Solver B faster :                 | <a href="#">31</a> | -                   | <a href="#">24</a> | <a href="#">7</a>   |
| Solver Solver B much faster :            | <a href="#">12</a> | -                   | <a href="#">4</a>  | <a href="#">8</a>   |
| Solver Solver B infinitely faster :      | <a href="#">20</a> | -                   | -                  | <a href="#">20</a>  |
| Both solvers failed to solve optimally : | <a href="#">8</a>  | -                   | <a href="#">8</a>  | -                   |
| <b>Total models: :</b>                   | <b>99</b>          | <b>5</b>            | <b>48</b>          | <b>46</b>           |

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Resource Time Comparison - All Models - Netscape 6

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**Solver Solver A much faster - Obj same for both solvers:**

| Modelname | Time (Solver A) | Time (Solver B) | Ratio (Solver A / Solver B) | Obj (Solver A)  | Obj (Solver B)  |
|-----------|-----------------|-----------------|-----------------------------|-----------------|-----------------|
| batch     | 0.2478          | 0.5100          | 0.486                       | 2.85506508E+05  | 2.85506500E+05  |
| ex1222    | 0.0629          | 99999.0000      | 0.000                       | 1.07654308E+00  | 1.07654300E+00  |
| ex4       | 1.1326          | 3.8400          | 0.295                       | -8.06413616E+00 | -8.06413600E+00 |
| util      | 0.6693          | 14.2400         | 0.047                       | 9.99578750E+02  | 9.99578800E+02  |

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**Solver Solver A much faster - Obj of Solver B better:**

| Modelname | Time (Solver A) | Time (Solver B) | Ratio (Solver A / Solver B) | Obj (Solver A)  | Obj (Solver B)         |
|-----------|-----------------|-----------------|-----------------------------|-----------------|------------------------|
| elf       | 0.0573          | 15.3200         | 0.004                       | 1.67500000E+00  | <b>1.91666700E-01</b>  |
| ex1243    | 0.1751          | 0.4600          | 0.381                       | 3.61754064E+05  | <b>8.34025100E+04</b>  |
| ex1244    | 0.3924          | 4.1400          | 0.095                       | 8.39892336E+04  | <b>8.20429100E+04</b>  |
| ex1264a   | 0.2024          | 4.3300          | 0.047                       | 1.13000000E+01  | <b>8.60000000E+00</b>  |
| gear4     | 0.1484          | 5.7500          | 0.026                       | 1.04279325E+05  | <b>1.64342800E+00</b>  |
| ortez     | 0.2091          | 1.3300          | 0.157                       | -4.88569077E+03 | <b>-9.53203900E+03</b> |
| spectra2  | 0.3781          | 5.8000          | 0.065                       | 1.93007357E+01  | <b>1.39783100E+01</b>  |

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Solver Square Comparison - All Models - Netscape 6

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## Solver Square Comparison: Considers all models.

**Date / Time:** 07/15/03 15:28:46

Solver comparison utility.

Compares all solver return outcomes (for example optimal, locally optimal, infeasible, unbounded, fail) of one solver with all return outcomes of another solver. Interrupt denotes resource or iteration limit has been reached. Solver Solver A is represented on the left (rows) and solver Solver B on top (columns). See the [solver return definitions](#) for return codes.

Models having trace data only in one trace file are listed in the "no data" column of the other.

|                       |                       |
|-----------------------|-----------------------|
| <b>Tracefile 1 :</b>  | <a href="#">A.trc</a> |
| <b>Tracefile 2 :</b>  | <a href="#">B.trc</a> |
| <b>Solvers used :</b> | Solver A              |
|                       | Solver B              |
| <b>Modeltype(s)</b>   | MINLP                 |

|                       | optimal | feasible           | infeasible        | unbounded | fail              | no data | total Solver A     |
|-----------------------|---------|--------------------|-------------------|-----------|-------------------|---------|--------------------|
| <b>optimal</b>        | -       | -                  | -                 | -         | -                 | -       | -                  |
| <b>feasible</b>       | -       | <a href="#">62</a> | <a href="#">2</a> | -         | <a href="#">2</a> | -       | <a href="#">66</a> |
| <b>infeasible</b>     | -       | <a href="#">1</a>  | -                 | -         | -                 | -       | <a href="#">1</a>  |
| <b>unbounded</b>      | -       | -                  | -                 | -         | -                 | -       | -                  |
| <b>fail</b>           | -       | <a href="#">19</a> | <a href="#">6</a> | -         | <a href="#">2</a> | -       | <a href="#">27</a> |
| <b>no data</b>        | -       | -                  | -                 | -         | -                 | -       | -                  |
| <b>total Solver B</b> | -       | <a href="#">82</a> | <a href="#">8</a> | -         | <a href="#">4</a> | -       | 94                 |

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Solver Square Comparison - All Models - Netscape 6

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### Solver Resource Times

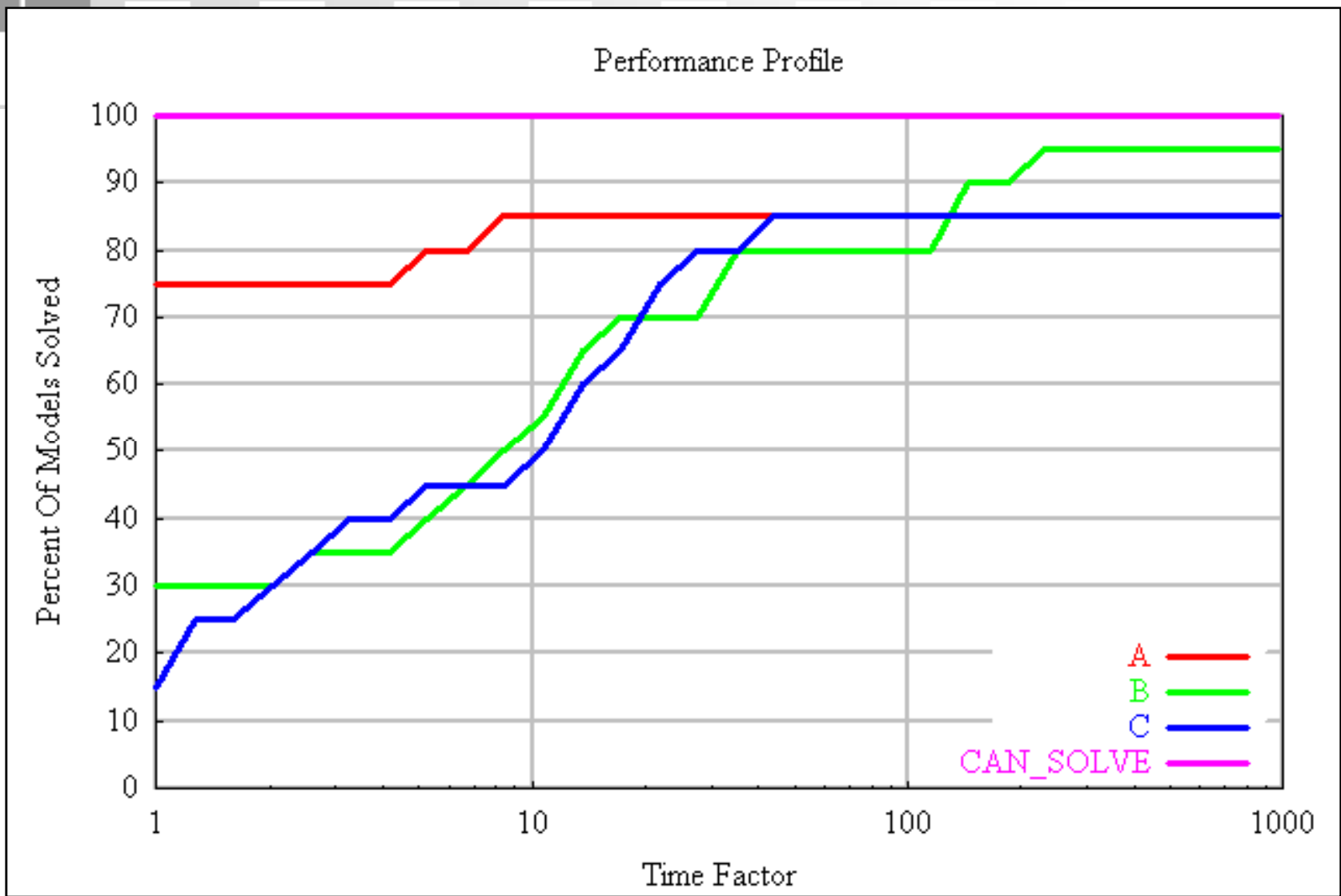
- Models for each solver pair outcome. Listed are the solver resource times `TIME(.)` in seconds, as well as the ratio `RATIO(./.)` of resource times for the two solvers if both solved optimally.
- Also listed are the objective values `OBJ(.)` using both solvers. The **better solution** found is listed in boldface. A solution is considered better, if the relative objective function difference is greater than 1.00E-05. If both solutions are less than 1e-1, we use the absolute difference.
- Solver resource time ratios for a particular model are listed only if one solver has resource greater than 5.00E-02.

Solver A: feasible -- Solver B: feasible [Back to top](#)

| Modelname  | Time (Solver A) | Time (Solver B) | Ratio (Solver A/Solver B) | Obj (Solver A)  | Obj (Solver B)    |
|------------|-----------------|-----------------|---------------------------|-----------------|-------------------|
| alan       | 0.0973          | 0.0100          | 9.730                     | 3.60000000      | <b>2.92500000</b> |
| batch      | 0.2478          | 0.5100          | 0.486                     | 285506.50824405 | 285506.50000000   |
| batchdes   | 0.1094          | 0.0400          | 2.735                     | 167427.65711470 | 167427.70000000   |
| du-opt     | 1.9718          | 0.5200          | 3.792                     | 31.02527833     | <b>3.55634000</b> |
| du-opt5    | 2.0975          | 1.7000          | 1.234                     | 40.77273140     | <b>8.07365800</b> |
| eg_all_s   | 28.3584         | 19.7400         | 1.437                     | 11.23946680     | <b>7.92018200</b> |
| eg_disc2_s | 63.1667         | 5.3400          | 11.829                    | 6.92006923      | <b>5.64210100</b> |
| eg_disc_s  | 88.8061         | 9.3800          | 9.468                     | 10.42127936     | <b>5.76054000</b> |
| eg_int_s   | 106.3869        | 7.7900          | 13.657                    | 7.88724302      | <b>7.46308000</b> |
| ex1222     | 0.0629          | 99999.0000      | 0.000                     | 1.07654308      | 1.07654300        |
| ex1223     | 0.1340          | 0.0200          | 6.702                     | 4.57958240      | 4.57958200        |
| ex1223a    | 0.1325          | 0.0100          | 13.246                    | 4.57958240      | 4.57958200        |
| ex1223b    | 0.1546          | 0.0200          | 7.729                     | 4.57958240      | 4.57958200        |
| ex1224     | 0.1645          | 0.0300          | 5.483                     | -0.94347050     | -0.94347050       |
| ex1225     | 0.1046          | 0.0100          | 10.459                    | 31.00000000     | 31.00000000       |

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# Lessons

- *Automate* the QA process and the certification
- Build early and *build often*
- *Incorporate* QA tools into the software and share the QA process
- Make the QA process *transparent and reproducible*
- *Involve solver developers and clients* into the QA process

# Summary

- SQA becomes more and more important for MP industry
- Our focus is on automated testing (reproducible full life cycle testing)
- Most of the test components are available as transparent GAMS models
- Involvement of the clients in the QA process is essential
- Benefits both for solver developers, for clients and for GAMS
- Open Source!

# References

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