# (MI)NLPLib 2

Stefan Vigerske



16th July 2015

ISMP, Pittsburgh

## Model instance collections

Collecting optimization problems has been a popular "hobby" for long time, e.g.,

first release	library	problem types
1985	Netlib	Linear Programming
1992	MIPLIB	Mixed-Integer Programming
1993	CUTE	Nonlinear Programming
1998	SDPLib	Semidefinite Programming
1999	CSPLib	Constraint Satisfaction Programming
199×	MacMINLP	Mixed-Integer Nonlinear Programming
2001	GAMS World	LP, MIP, NLP, MINLP, SOCP, MPEC
2003	COCONUT	Nonlinear and Constraint Satisfaction Programming
2008	mintOC	Mixed-Integer Optimal Control
2009	minlp.org	MINLP, General Disjunctive Programming
2011	POLIP	Mixed-Integer Polynomial Programming
2014	CBLIB	Conic Programming

- for solver developers, access to a wide set of interesting problem instances with different characteristics has always been important
- commercial solver vendors test their solver on thousands of test problems before releasing a new software version
- the evaluation of algorithmic improvements (w.r.t. robustness and efficiency) requires well-balanced test sets of significantly many real-world instances

## MINLPLib and GLOBALLib

#### http://www.gamsworld.org

- Initiated in 2001 (as part of GamsWorld/MinlpWorld/GlobalWorld): M. Bussieck, A. Drud, and A. Meeraus
   MINLPLib – A Collection of Test Models for Mixed-Integer Nonlinear Programming INFORMS Journal on Computing 15, 114–119 (2003)
- "white-box" NLPs (GLOBALLib) and MINLPs (MINLPLib)



#### MINLPLib Model Statistics

Name	#Eqns	#Vars	#DVars	#NZ	#NNZ	BestInt	at Point
<u>4stufen</u>	99	150	48	319	87	116329.6706	<u>p1</u>
<u>alan</u>	8	9	4	24	3	2.9250	<u>p1</u>
batch	74	47	24	191	22	285506.5082	<u>p1</u>
<u>batchdes</u>	20	20	9	53	10	167427.6571	<u>p1</u>
beuster	115	158	52	398	159	116347.9503	<u>p1</u>
blendgap	360	332	66	1454	440	-19134.6103	<u>p1</u>
cecil 13	899	841	180	2812	360	-115656.4997	p2
chp partload	2517	2249	45	6940	1916	23.5537	p1
contvar	285	297	88	1281	530	809149.8272	<u>p1</u>
csched1	23	77	63	174	8	-30639.2578	<u>p1</u>
csched1a	23	29	15	78	7	-30430.1770	p1
csched2	138	401	308	958	58	-166101.9964	p1
<u>csched2a</u>	138	233	140	622	57	-165398.7013	<u>p2</u>

frequently used for testing, but also benchmarking

```
Variables x1,x2,b3,b4,b5,objvar;
Positive Variables x1,x2;
Binary Variables b3,b4,b5;
Equations e1,e2,e3,e4,e5,e6;
e1.. - 2*x1 - 3*x2 - 1.5*b3 - 2*b4 + 0.5*b5 + objvar =E= 0;
e2.. sqr(x1) + b3 =E= 1.25;
e3.. x2**1.5 + 1.5*b4 =E= 3;
e4.. x1 + b3 =L= 1.6;
e5.. 1.333*x2 + b4 =L= 3;
e6.. - b3 - b4 + b5 =L= 0;
```

```
Variables x1,x2,b3,b4,b5,objvar;
Positive Variables x1,x2;
Binary Variables b3,b4,b5;
Equations e1,e2,e3,e4,e5,e6;
e1.. - 2*x1 - 3*x2 - 1.5*b3 - 2*b4 + 0.5*b5 + objvar =E= 0;
e2.. sqr(x1) + b3 =E= 1.25;
e3.. x2**1.5 + 1.5*b4 =E= 3;
e4.. x1 + b3 =L= 1.6;
e5.. 1.333*x2 + b4 =L= 3;
e6.. - b3 - b4 + b5 =L= 0;
```

- varying from small scale (great for debugging!) to large scale real world instances (agricultural economics, chemical-, civil-, and electrical engineering, finance, management, OR)
- intentionally including instances from badly formulated models or different formulations of the same problem

```
Variables x1,x2,b3,b4,b5,objvar;
Positive Variables x1,x2;
Binary Variables b3,b4,b5;
Equations e1,e2,e3,e4,e5,e6;
e1.. - 2*x1 - 3*x2 - 1.5*b3 - 2*b4 + 0.5*b5 + objvar =E= 0;
e2.. sqr(x1) + b3 =E= 1.25;
e3.. x2**1.5 + 1.5*b4 =E= 3;
e4.. x1 + b3 =L= 1.6;
e5.. 1.333*x2 + b4 =L= 3;
e6.. - b3 - b4 + b5 =L= 0;
```

- varying from small scale (great for debugging!) to large scale real world instances (agricultural economics, chemical-, civil-, and electrical engineering, finance, management, OR)
- intentionally including instances from badly formulated models or different formulations of the same problem
- including solution points for many instances

```
Variables x1,x2,b3,b4,b5,objvar;
Positive Variables x1,x2;
Binary Variables b3,b4,b5;
Equations e1,e2,e3,e4,e5,e6;
e1.. - 2*x1 - 3*x2 - 1.5*b3 - 2*b4 + 0.5*b5 + objvar =E= 0;
e2.. sqr(x1) + b3 =E= 1.25;
e3.. x2**1.5 + 1.5*b4 =E= 3;
e4.. x1 + b3 =L= 1.6;
e5.. 1.333*x2 + b4 =L= 3;
e6.. - b3 - b4 + b5 =L= 0;
```

- varying from small scale (great for debugging!) to large scale real world instances (agricultural economics, chemical-, civil-, and electrical engineering, finance, management, OR)
- intentionally including instances from badly formulated models or different formulations of the same problem
- including solution points for many instances
- solely an instance collection, i.e., consisting of instantiations of models by specific data sets

## MINLPLib and GLOBALLib History

- instances were harvested from existing collections, initially:
  - GAMS Model Library
  - MacMINLP (Leyffer)
  - MINOPT library (Floudas)
  - Handbook of Test Problems in Local and Global Optimization (Floudas et.al.)
- ▶ 2001 2009: maintained by Michael Bussieck
- new instances were added
- new incumbent solutions were added
- ▶ in 2009: Michael "volunteered" me as maintainer





### MINLPLib 2

MINLPLib Instance Listing

#### Show All : entries

Name	Formats	Туре	( C)	#Vars	#BinVars	#IntVars #Cons	#SOS #5	Semi #NZ	CoefRange	S Dual Bound	Primal Bound Points
<u>4stufen</u>	ams mod ni osil	MBNLP		149	48	98		318	1.21e+11	102938.0658	116329.6706 <u>p1</u>
abel	<u>ams lp mod nl osil pip</u>	QP	*	30		14		100	2.86e+04	* 225.1946	225.1946 pl
<u>alan</u>	ams ip mod ni osil pip	MBQP	*	8	4	7		23	1.20e+01	* 2.9250	2.9250 pl
<u>alkvi</u>	ams mod ni osil	NLP		14		7		31	7.35e+03	-1.7650	-1.7650 <u>pl</u>
alkylation	ams mod nl osil	NLP		10		11		37	3.35e+05	* 1768.8073	1768.8070 <u>p1</u>
arki0001	ams le mod ni osil pip	QP	*	1030		513		3813	4.32e+09	* 40.7129	40.7129 pl

#### Tasks:

- Adding new problem instances:
  - both convex and nonconvex problems
  - (MI)QPs, (MI)QCQPs, and (MI)NLPs
  - easy solvable, solvable, difficult to solve, but not trivial
- Categorizing instances
  - convexity
  - problem type (quadratic, polynomial, general nonlinear)
  - function types (powers, exp/log, trigonometric, ...)
  - solved to global optimality?
- Providing feasible best known solutions

Work in progress, current version publicly available: http://www.gamsworld.org/minlp/minlplib2/html/index.html. Search

### New NLP and MINLP Instances



# Sources of newly added instances

Harvesting mainly from

- CMU-IBM open source MINLP project (convex MINLPs)
- minlp.org
- POLIP (polynomial MINLPs)



MINLPLib 2 instance sources (1357 in total)

### Instance Formats

Format		#instance	S
GAMS	.gms	1363	
AIMMS	.ams	1352	(no Gamma, latest additions missing)
AMPL	.mod	1337	(no errorf/signpower/Gamma/)
AMPL	.nl	1331	(no errorf/signpower/Gamma/, latest missing)
OSIL	XML	1342	(no signpower/Gamma/)
CPLEX LP	.lp	667	(limited to quadratics)
PIP	.pip	770	(limited to polynomial)

## Problem types





(top: Objective Gradient and Jacobian; bottom: Lagrangian Hessian)

## Sparsity Pattern – Examples (cont.)

Jacobian densitymod (Density modification based on single-crystal X-ray diffraction data; 23529 vars, 550 cons.)

Jacobian lop97ic (Rail Line Optimization, MIQCQP)

milinfract (Solving Mixed-Integer Linear Fractional Programming Problems with Dinkelbach's Algorithm)

Objective Gradient + Jacobian

Lagrangian Hessian





# (Non)Convexity Detection for Functions

Analyze the Hessian:

- Given twice differentiable function h(x) and variable bounds  $[\underline{x}, \overline{x}]$ .
- ► Compute the spectrum of the Hessian in one random point and conclude
  - convexity/concavity/indefiniteness if h(x) is quadratic
  - nonconvexity/nonconcavity if h(x) is general nonlinear

## (Non)Convexity Detection for Functions

Analyze the Hessian:

- Given twice differentiable function h(x) and variable bounds  $[\underline{x}, \overline{x}]$ .
- ► Compute the spectrum of the Hessian in one random point and conclude
  - convexity/concavity/indefiniteness if h(x) is quadratic
  - nonconvexity/nonconcavity if h(x) is general nonlinear

Analyze the Algebraic Expression:

$$\begin{split} f(x) \ \text{convex} \Rightarrow \ a \cdot f(x) \begin{cases} \text{convex}, & a \ge 0\\ \text{concave}, & a \le 0 \end{cases} \\ f(x), g(x) \ \text{convex} \Rightarrow \ f(x) + g(x) \ \text{convex} \\ f(x) \ \text{concave} \Rightarrow \ \log(f(x)) \ \text{concave} \end{cases} \\ f(x) = \prod_{i} x_i^{e_i}, x_i \ge 0 \Rightarrow \ f(x) \begin{cases} \text{convex}, & e_i \le 0 \ \forall i \\ \text{convex}, & \exists j : e_i \le 0 \ \forall i \ne j; \ \sum_i e_i \ge 1 \\ \text{concave}, & e_i \ge 0 \ \forall i; \ \sum_i e_i \le 1 \end{cases} \end{split}$$

## (Non)Convexity Detection for Functions

Analyze the Hessian:

- Given twice differentiable function h(x) and variable bounds  $[\underline{x}, \overline{x}]$ .
- ► Compute the spectrum of the Hessian in one random point and conclude
  - convexity/concavity/indefiniteness if h(x) is quadratic
  - nonconvexity/nonconcavity if h(x) is general nonlinear

Analyze the Algebraic Expression:

$$\begin{split} f(x) \text{ convex} &\Rightarrow a \cdot f(x) \begin{cases} \text{convex}, & a \geq 0\\ \text{concave}, & a \leq 0 \end{cases} \\ f(x), g(x) \text{ convex} &\Rightarrow f(x) + g(x) \text{ convex} \\ f(x) \text{ concave} &\Rightarrow \log(f(x)) \text{ concave} \end{cases} \\ (x) &= \prod_{i} x_{i}^{e_{i}}, x_{i} \geq 0 \Rightarrow f(x) \begin{cases} \text{convex}, & e_{i} \leq 0 \ \forall i \\ \text{convex}, & \exists j : e_{i} \leq 0 \ \forall i \neq j; \ \sum_{i} e_{i} \geq 1 \\ \text{concave}, & e_{i} \geq 0 \ \forall i; \ \sum_{i} e_{i} \leq 1 \end{cases} \end{split}$$

Analyze manually.

f

# (Non)Convexity in MINLPLib

- ▶ Numerical analysis of (pointwise) Hessians by LAPACK.
- Symbolic analysis of expressions by SCIP.
- Mark additional 71 instances (5%) as convex.

MINLPLib instances convexity



### Solution Points

MINLPLib instances traditionally come with known feasible solution points.

## Solution Points

MINLPLib instances traditionally come with known feasible solution points.

For MINLPLib 2, we added

Feasibility checking:

- compute maximal (unscaled) violation of constraints, variable bounds, and discreteness restrictions
- uses GAMS/EXAMINER2

## Solution Points

MINLPLib instances traditionally come with known feasible solution points.

For MINLPLib 2, we added

Feasibility checking:

- compute maximal (unscaled) violation of constraints, variable bounds, and discreteness restrictions
- uses GAMS/EXAMINER2
- Solution polishing: For a given point,
  - 1. project onto variable bounds
  - 2. round values for discrete variables to exact integers
  - 3. ensure that semicontinuity/semiintegrality and special-ordered-set constraints are exactly satisfied
  - run CONOPT on MINLP with all binary/integer/semi\*/SOS variables fixed, start from updated point, scaling disabled, feasibility tolerance 10<sup>-9</sup>

## Polished Solution Points



## Polished Solution Points



#### Available in two formats:

GAMS Data Exchange (GDX)		ASCII (.sol)
Exercise         Algorithm         24.2.0         r41922         A           LFA         Released         SSep13         LEG         x86         64/Linux         Image: Solution           n         file         0         Image: Signature Solution         File         Solution	x1	1.11803398874989001754
040CG00? <u>BIBBEB</u> ATA_0000 <u>BIBBEB</u> ATA_0000 <u>BIBBEB</u> ATA_0000 <u>BIBBEB</u> ATA_0000 <u>BIBBE</u>	x2	1.31037069710444997739
	b4	1.0000000000000000000000000000000000000
国和時期のJVAFB国和時度的FMB」を設定11 国家設定11 UEL 国家にはして ncolcnt minrowcnt_UEL 客路CRO 客路ORS 客部OMS 多数の後を客部の	b5	1.0000000000000000000000000000000000000
	objvar	7.66718006881313041134

#### 16 / 64

dual bound =  $\begin{cases} \text{lower bound on optimal value,} & \text{if minimization} \\ \text{upper bound on optimal value,} & \text{if maximization} \end{cases}$ 

dual bound =  $\begin{cases} lower bound on optimal value, & if minimization \\ upper bound on optimal value, & if maximization \end{cases}$ 

#### Collected dual bounds from

- solvers for general (MI)NLP (ANTIGONE, BARON, Couenne, Lindo, SCIP)
- solvers for convex MINLP on proven convex MINLPs (AlphaECP, Bonmin BB, Bonmin Hyb)

dual bound =  $\begin{cases} lower bound on optimal value, & if minimization \\ upper bound on optimal value, & if maximization \end{cases}$ 

### Collected dual bounds from

- solvers for general (MI)NLP (ANTIGONE, BARON, Couenne, Lindo, SCIP)
- solvers for convex MINLP on proven convex MINLPs (AlphaECP, Bonmin BB, Bonmin Hyb)

But: No way to verify correctness of bound!



dual bound =  $\begin{cases} lower bound on optimal value, & if minimization \\ upper bound on optimal value, & if maximization \end{cases}$ 

### Collected dual bounds from

- solvers for general (MI)NLP (ANTIGONE, BARON, Couenne, Lindo, SCIP)
- solvers for convex MINLP on proven convex MINLPs (AlphaECP, Bonmin BB, Bonmin Hyb)

But: No way to verify correctness of bound!



Conservative approach: Only trust a solvers dual bound claim if it has been verified by at least 2 other solvers.

## "Open" instances

 $\mathsf{Feasible \ solution \ points \oplus trusted \ dual \ bounds \Rightarrow trusted \ gap}$ 



## Query the MINLPLib

Simple script to select instances by specific criteria, e.g.:

- ▶ all large convex instances, show # var. and # cons.:
  - \$ ./query.py "(nvars > 4242) & (convex == True)" -c nvars -c ncons

	nvars	ncons
jbearing100	5304	0
squf1030-150	4530	4650
watercontamination0202	106711	107209
watercontamination0303	107222	108217

all quadratic instances:

./query.py "npolynomfunc == 0 & nsignomfunc == 0 & ngennlfunc == 0"

all instances with trigonometric functions:

./query.py "(opsin == True) or (opcos == True)"

all separable instances, sorted by problem type:

./query.py "nlaghessiannz == nlaghessiandiagnz" -s probtype -c probtype

all unsolved instances (w.r.t. "trusted" dual bounds), zipped up:

./query.py "gap > 0.1" -c gap -z open.zip

What to do with all these instances?

What to do with all these instances?

#### General Purpose Global Solvers Benchmark?

date	GAMS	ANTIGONE	BARON	COUENNE	LINDO	SCIP
07/15	24.5 $\alpha$	1.1	15.6.5	0.5	9.0.1983.157	3.2.0

• • •

Today: Go Columnwise		
date GAMS ANTIGONE BARON COUENNE LI	INDO	SCIP
08/11 23.7.3 – <b>9.3</b> .1 <b>0.3 6.</b>	<b>.1</b> .1.588	_
04/12 23.8.2 – <b>10.2</b> .0 <b>0.4 7</b> .	<b>.0</b> .1.421	<b>2.1</b> .1
11/12 23.9.5 – <b>11.5</b> .2 0.4 7.	.0.1.497	2.1.2
02/13 24.0.2 – <b>11.9</b> .1 0.4 7.	.0.1.497	3.0
07/13 24.1.3 <b>1.1 12.3</b> .3 0.4 <b>8</b> .	<b>.0</b> .1283.385	3.0
05/14 24.2.3 1.1 <b>12.7</b> .7 0.4 8.	.0.1694.498	3.0
09/14 24.3.3 1.1 <b>14.0</b> .3 0.4 8.	.0.1694.550	3.1
06/15 24.4.6 1.1 <b>14.4</b> .0 0.4 <b>9</b> .	<b>.0</b> .1983.157	3.1
$07/15$ 24.5 $\alpha$ 1.1 <b>15.6</b> .5 <b>0.5</b> 9.	.0.1983.157	<b>3.2</b> .0

- ► ANTIGONE by R. Misener (Imperial College) and Ch. Floudas (Texas A&M)
- BARON by N. Sahinidis (CMU), M. Tawarmalani (Purdue), et.al.
- Couenne by P. Belotti (now FICO), et.al.; open-source (COIN-OR)
- Lindo API by Lindo Systems Inc.
- ▶ SCIP by Zuse Institute Berlin, TU Darmstadt, FAU Erlangen; free for academic use

Quantify Improvements of global MINLP solvers over the last 4 years!

### Which instances to run?

Does the current MINLPLib 2 with its 1363 instances qualify as a good test set?

### Which instances to run?

Does the current MINLPLib 2 with its 1363 instances qualify as a good test set?

✓ large number of instances

 $\Rightarrow$  40 solver versions  $\times$  1363 instances = 54520 runs (!)

### Which instances to run?

Does the current MINLPLib 2 with its 1363 instances qualify as a good test set?

 $\checkmark$  large number of instances

 $\Rightarrow$  40 solver versions  $\times$  1363 instances = 54520 runs (!)

 $\checkmark\,$  wide variety of applications
Does the current MINLPLib 2 with its 1363 instances qualify as a good test set?

- $\checkmark$  large number of instances
  - $\Rightarrow$  40 solver versions  $\times$  1363 instances = 54520 runs (!)
- $\checkmark$  wide variety of applications
- × dominance of certain models, e.g.,
  - 32 block layout design problems
  - 60 small investor portfolio optimization instances
  - ▶ ...

Does the current MINLPLib 2 with its 1363 instances qualify as a good test set?

- ✓ large number of instances
  - $\Rightarrow$  40 solver versions  $\times$  1363 instances = 54520 runs (!)
- $\checkmark$  wide variety of applications
- × dominance of certain models, e.g.,
  - 32 block layout design problems
  - 60 small investor portfolio optimization instances
  - ► ...

imes many trivial, some hopeless, some numerically dubious instances

Does the current MINLPLib 2 with its 1363 instances qualify as a good test set?

- $\checkmark$  large number of instances
  - $\Rightarrow$  40 solver versions  $\times$  1363 instances = 54520 runs (!)
- $\checkmark$  wide variety of applications
- × dominance of certain models, e.g.,
  - 32 block layout design problems
  - 60 small investor portfolio optimization instances
  - **١**...

imes many trivial, some hopeless, some numerically dubious instances

Thus, need to select a reasonable subset of (e.g., 87) instances.

Does the current MINLPLib 2 with its 1363 instances qualify as a good test set?

- ✓ large number of instances
  - $\Rightarrow$  40 solver versions  $\times$  1363 instances = 54520 runs (!)
- $\checkmark$  wide variety of applications
- × dominance of certain models, e.g.,
  - 32 block layout design problems
  - 60 small investor portfolio optimization instances
  - <u>►</u>

imes many trivial, some hopeless, some numerically dubious instances

Thus, need to select a reasonable subset of (e.g., 87) instances.

With 15 co-authors and 8 months of time, this would be no problem.

MIPLIB 2010

Mixed Integer Programming Library version 5

Thorsten Koch · Tobias Achterberg · Erling Andersen · Oliver Bastert · Timo Berthold · Robert E. Bixby · Emilie Danna · Gerald Gamrath · Ambros M. Gleixner · Stefan Heinz · Andrea Lodi · Hans Mittelmann · Ted Ralphs · Domenico Salvagnin · Daniel E. Steffy · Kati Wolter

But with 3 weeks until ISMP: Apply the P.I.T.T. heuristic.

### Prune Instances by Tractability and Triviality Heuristic

#### 1. Remove intractable instances

 consider only the 881 instances that are marked as solved in MINLPLib 2





# Prune Instances by Tractability and Triviality Heuristic 2. For each solver separately:

- Remove instances that are solved within 60 seconds by the oldest solver version (e.g., as in GAMS 23.7).
- Remove instances that the solver cannot handle (due to trigonometric functions, SOS, ...).



In case of SCIP:

#### Prune Instances by Tractability and Triviality Heuristic For SCIP, this leaves 312 instances:

alkylation	clay0304h	ex6_1_1	fo9_ar5_1	house
arki0003	clay0305h	ex6_1_3	gasnet	jbearing25
arki0005	crudeoil_lee2_10	ex6_2_12	genpooling_meyer04	jbearing75
arki0006	crudeoil_lee3_07	ex6_2_14	ghg_1veh	johnall
arki0019	crudeoil_lee3_08	ex6_2_8	ghg_3veh	kall_circles_c6a
arki0024	crudeoil_lee3_09	ex6_2_9	glider100	kall_circles_c6b
autocorr_bern20-10	crudeoil_lee3_10	ex7_2_4	graphpart_2g-0066-0066	kall_circles_c7a
autocorr_bern20-15	crudeoil_li06	ex8_1_7	graphpart_2g-0077-0077	kall_circles_c8a
autocorr_bern25-06	csched1a	ex8_2_1b	graphpart_2g-0088-0088	kall_circlespolygons_c1
autocorr_bern25-13	edgecross10-060	ex8_2_4b	graphpart_2g-0099-9211	kall_circlespolygons_c1
autocorr_bern30-04	edgecross10-070	ex8_4_1	graphpart_2pm-0066-0066	kall_circlesrectangles_c
autocorr_bern35-04	edgecross10-080	ex8_4_3	graphpart_2pm-0077-0777	kall_circlesrectangles_c
batch0812_nc	edgecross14-039	ex8_4_4	graphpart_2pm-0088-0888	kall_congruentcircles_c
batchs201210m	edgecross14-058	ex8_4_5	graphpart_2pm-0099-0999	kall_diffcircles_10
bayes2_50	edgecross14-078	$ex8_4_8_bnd$	graphpart_3g-0334-0334	kall_diffcircles_5b
blend480	edgecross14-176	filter	graphpart_3g-0344-0344	kall_diffcircles_7
blend531	edgecross20-040	fin2bb	graphpart_3g-0444-0444	kall_diffcircles_8
blend718	edgecross22-048	flay05h	graphpart_3pm-0244-0244	kall_diffcircles_9
blend852	emf1050_5_5	fo7	graphpart_3pm-0333-0333	launch
carton7	emfl100_5_5	fo8	graphpart_3pm-0334-0334	lop97icx
casctanks	ethanolh	fo8_ar25_1	graphpart_3pm-0344-0344	mathopt5_7
cecil_13	ethanolm	fo8_ar2_1	graphpart_3pm-0444-0444	mathopt5_8
chem	ex1252a	fo9	graphpart_clique-30	mhw4d
clay0203h	ex14_1_1	fo9_ar25_1	graphpart_clique-40	milinfract
clay0204h	ex14_1_7	fo9_ar2_1	gsg_0001	minlphix
clay0205h	ex4_1_5	fo9_ar3_1	hda	minsurf100
clay0303h	ex4_1_6	fo9_ar4_1	heatexch_trigen	

#### Prune Instances by Tractability and Triviality Heuristic For SCIP, this leaves 312 instances – obvious dominance by some models:

alkylation d	clay0304h	ex6_1_1	fo9_ar5_1	house
arki0003 d	clay0305h	ex6_1_3	gasnet	jbearing25
arki0005 d	crudeoil_lee2_10	ex6_2_12	genpooling_meyer04	jbearing75
arki0006 d	crudeoil_lee3_07	ex6_2_14	ghg_1veh	johnall
arki0019 d	crudeoil_lee3_08	ex6_2_8	ghg_3veh	kall_circles_c6a
arki0024 d	crudeoil_lee3_09	ex6_2_9	glider100	kall_circles_c6b
autocorr_bern20-10 d	crudeoil_lee3_10	ex7_2_4	graphpart_2g-0066-0066	kall_circles_c7a
autocorr_bern20-15 d	crudeoil_li06	ex8_1_7	graphpart_2g-0077-0077	kall_circles_c8a
autocorr_bern25-06 d	csched1a	ex8_2_1b	graphpart_2g-0088-0088	kall_circlespolygons_c1
autocorr_bern25-13 e	edgecross10-060	ex8_2_4b	graphpart_2g-0099-9211	kall_circlespolygons_c1
autocorr_bern30-04 e	edgecross10-070	ex8_4_1	graphpart_2pm-0066-0066	kall_circlesrectangles_c
autocorr_bern35-04 e	edgecross10-080	ex8_4_3	graphpart_2pm-0077-0777	kall_circlesrectangles_c
batch0812_nc e	edgecross14-039	ex8_4_4	graphpart_2pm-0088-0888	kall_congruentcircles_c
batchs201210m e	edgecross14-058	ex8_4_5	graphpart_2pm-0099-0999	kall_diffcircles_10
bayes2_50 e	edgecross14-078	$ex8_4_8_bnd$	graphpart_3g-0334-0334	kall_diffcircles_5b
blend480 e	edgecross14-176	filter	graphpart_3g-0344-0344	kall_diffcircles_7
blend531 e	edgecross20-040	fin2bb	graphpart_3g-0444-0444	kall_diffcircles_8
blend718 e	edgecross22-048	flay05h	graphpart_3pm-0244-0244	kall_diffcircles_9
blend852 e	emf1050_5_5	fo7	graphpart_3pm-0333-0333	launch
carton7 e	emfl100_5_5	fo8	graphpart_3pm-0334-0334	lop97icx
casctanks e	ethanolh	fo8_ar25_1	graphpart_3pm-0344-0344	mathopt5_7
cecil_13 e	ethanolm	fo8_ar2_1	graphpart_3pm-0444-0444	mathopt5_8
chem e	ex1252a	fo9	graphpart_clique-30	mhw4d
clay0203h e	ex14_1_1	fo9_ar25_1	graphpart_clique-40	milinfract
clay0204h e	ex14_1_7	fo9_ar2_1	gsg_0001	minlphix
clay0205h e	ex4_1_5	fo9_ar3_1	hda	minsurf100
clay0303h e	ex4_1_6	fo9_ar4_1	heatexch_trigen	

### P.I.T.T.E.D. Heuristic: P.I.T.T. with Eased Dominance

3. Ensure uniqueness of 6-characters-prefix of instances names.

### P.I.T.T.E.D. Heuristic: P.I.T.T. with Eased Dominance 3. Ensure uniqueness of 6-characters-prefix of instances names.

alkylation clay0304h ex6\_1\_1 arki0003 clav0305h ex6 1 3 arki0005 crudeoil\_lee2\_10 ex6\_2\_12 arki0006 crudeoil lee3 07 ex6 2 14 arki0019 crudeoil lee3 08 ex6 2 8 arki0024 crudeoil\_lee3\_09 ex6\_2\_9 autocorr\_bern20-10 crudeoil lee3 10 ex7 2 4 autocorr\_bern20-15 crudeoil li06 ex8 1 7 autocorr bern25-06 csched1a ex8\_2\_1b autocorr\_bern25-13 edgecross10-060 ex8 2 4b autocorr\_bern30-04 edgecross10-070 ex8\_4\_1 autocorr\_bern35-04 edgecross10-080 ex8\_4\_3 batch0812 nc edgecross14-039 ex8 4 4 batchs201210m edgecross14-058 ex8\_4\_5 bayes2\_50 edgecross14-078 ex8 4 8 bnd blend480 edgecross14-176 filter blend531 edgecross20-040 fin2bb blend718 edgecross22-048 flav05h blend852 emf1050\_5\_5 fo7 carton7 emf1100 5 5 fo8 casctanks ethanolh fo8 ar25 1 cecil 13 ethanolm fo8\_ar2\_1 chem ex1252a fo9 clay0203h ex14 1 1 fo9 ar25 1 clav0204h ex14\_1\_7 fo9\_ar2\_1 clay0205h ex4 1 5 fo9 ar3 1 clav0303h ex4 1 6 fo9 ar4 1

fo9 ar5 1 house gasnet jbearing25 genpooling\_meyer04 jbearing75 ghg\_1veh johnall ghg\_3veh kall\_circles\_c6a glider100 kall circles c6b graphpart\_2g-0066-0066 kall\_circles\_c7a graphpart\_2g-0077-0077 kall\_circles\_c8a graphpart 2g-0088-0088 kall circlespolvgons c1 graphpart\_2g-0099-9211 kall\_circlespolygons\_c1 graphpart\_2pm-0066-0066 kall\_circlesrectangles\_ graphpart\_2pm-0077-0777 kall\_circlesrectangles\_ graphpart\_2pm-0088-0888 kall\_congruentcircles\_c graphpart\_2pm-0099-0999 kall diffcircles 10 graphpart\_3g-0334-0334 kall\_diffcircles\_5b graphpart\_3g-0344-0344 kall diffcircles 7 graphpart\_3g-0444-0444 kall diffcircles 8 graphpart\_3pm-0244-0244 kall\_diffcircles\_9 graphpart\_3pm-0333-0333 launch graphpart\_3pm-0334-0334 lop97icx graphpart\_3pm-0344-0344 mathopt5\_7 graphpart\_3pm-0444-0444 mathopt5 8 graphpart\_clique-30 mhw4d graphpart\_clique-40 milinfract gsg\_0001 minlphix hda minsurf100 heatexch trigen . . .

### P.I.T.T.E.D. SCIP testset

In summary:

- 1. Keep only instances that are marked as solved in MINLPLib 2.
- 2. Keep only instances that take  $\geq$  60s with oldest version of solver and that can be handled by solver.
- 3. Reduce instances with similar names.

For SCIP, this reduces from 1363 to 881 to 123 instances:

alkylation arki0003	emf1050_5_5 emf1100_5_5	fo9_ar25_1 gasnet	milinfract minlphix	pinene50 pointpack08	sssd12-05
arki0003 autocorr_bern20-10 batch0812_nc batch0812_10m bayes2_50 blend480 blend531 blend718 blend852 carton7 casctanks cecil_13 chem clay0203h clay0303h crudeoil_lee2_10 csched1a	emfl100_5_5 ethanolh ex1252a ex14_1_1 ex4_1_5 ex6_1_1 ex6_2_12 ex7_2_4 ex8_1_7 ex8_2_1b ex8_4_1 filter fin2bb flay05h fo7 fo8 fo8 ar25_1	<pre>gasnet genpooling_meyer04 ghg_1veh ghg_3veh glider100 graphpart_2g-0066-0 gsg_0001 hda heatexch_trigen house jbearing25 johnal1 kall_circles_c6a kall_diffcircles_10 launch lop97icx mathopt5_7</pre>	<pre>minlphix minsurf100 multiplants_mtg1a no7_ar3_1 nous1 000609 nvs22 o7 o7_2 o7_ar25_1 o7_ar3_1 o7_ar4_1 o7_ar5_1 008_ar4_1 o9_ar4_1 oil oil2</pre>	<pre>pointpack08 pooling_epa1 prob07 process procsyn prolog qp3 routingdelay_bigm rsyn0805m02h sepasequ_convent sfacloc2_2_80 slay07h slay09h slay10h smallinvDAXr1b020- sporttournament14 squf1010-025</pre>	sssd12-05 sssd15-04 sssd16-07 sssd18-06 sssd20-04 st_e35 stockcycl1 supplycha: syn10m03h syn15m02h syn20m02h syn30h syn30m02h
edgecross10-060	fo9	mhw4d	parallel	sssd08-04	

### PITT test set for each solver

Removed easy and unsolvable instances:



### PITTED test set for each solver

Removed easy and unsolvable instances, then filter by name:



### Run jobs

date	GAMS	ANTIGONE	BARON	COUENNE	LINDO	SCIP
08/11	23.7.3	-	<b>9.3</b> .1	0.3	<b>6.1</b> .1.588	_
04/12	23.8.2	-	10.2.0	0.4	7.0.1.421	<b>2.1</b> .1
11/12	23.9.5	-	<b>11.5</b> .2	0.4	7.0.1.497	2.1.2
02/13	24.0.2	-	11.9.1	0.4	7.0.1.497	3.0
07/13	24.1.3	1.1	12.3.3	0.4	8.0.1283.385	3.0
05/14	24.2.3	1.1	12.7.7	0.4	8.0.1694.498	3.0
09/14	24.3.3	1.1	<b>14.0</b> .3	0.4	8.0.1694.550	3.1
06/15	24.4.6	1.1	<b>14.4</b> .0	0.4	<b>9.0</b> .1983.157	3.1
07/15	$24.5\alpha$	1.1	15.6.5	0.5	9.0.1983.157	<b>3.2</b> .0

```
for GAMS in $GAMSS ; do
for SOLVER in $SOLVERS($GAMS) ; do
for INSTANCE in $TESTSET($SOLVER) ; do
    sbatch --exclusive --time=0:1800 $GAMS $INSTANCE SOLVER=$SOLVER
    done
    done
done
```

Hardware: Dell PowerEdge M1000e, 48GB RAM, Intel Xeon X5672@3.2GHz

### BARON: Fails

A solver failed, if it

- crashed, or
- ▶ reported an infeasible point as feasible (tolerance: 10<sup>-4</sup>), or
- ▶ reported a suboptimal solution as optimal (tolerance: 10<sup>-4</sup>)



### BARON: Solved

Solved: solver did not fail and reports a relative optimality gap  $\leq 10^{-4}$ 



### BARON: Solved – What happened?



From the release notes:

- 11.0: "This version comes with a wealth of new branching, relaxation, convexity exploitation, local search, and range reduction techniques."
- 11.5: "Improvements in local search" (dive-and-round heuristic for MINLPs, automatically select and switch back and forth between NLP solvers)
- 12.3: "New relaxations for certain types of quadratic problems", "Improved integer presolve", "Incorporation of convex envelopes for certain low-dimensional functions"
- 14.0: "Significant advances in the handling of integer programs." (integer cutting planes, calls to MIP solvers, hybrid LP/MIP/NLP relaxations)

### BARON: Found optimal solution



BARON: Solving time on instances that never failed (163)



#### Overall speedup: 9.00

12.7: "Automatic setting of many options based on problem characteristics and learning algorithms."

BARON: Solving time on instances solved by all vers. (69)



Overall speedup: 3.67

### ANTIGONE: Fails



### ANTIGONE: Solved



### ANTIGONE: Found optimal solution



### ANTIGONE: Solving time on instances that never failed (177)



### ANTIGONE: Solving time on instances solved by all (110)



### **COUENNE:** Fails



### COUENNE: Solved



### COUENNE: Found optimal solution



COUENNE: Solving time on instances that never failed (65)



Overall speedup: 1.35

### COUENNE: Solving time on instances that never failed (65)

## [Couenne] Couenne stable release 0.4

Pietro Belotti <u>pbelott at clemson.edu</u> Mon Aug 8 05:13:15 EDT 2011

- Next message: [Couenne] stable/0.4 does not compile
- Messages sorted by: [ date ] [ thread ] [ subject ] [ author ]

Dear Couenne users,

this is to announce the 0.4 stable version of Couenne. There are a number of additions and improvements, including:

1) a Feasibility Pump heuristic for non-convex MINLP, developed with Timo Berthold at the ZIB institute.

 Orbital Branching for MINLP, developed with Jim Ostrowski and Leo Liberti.

 Fixed Point Bound tightening, a bound reduction procedure developed with Sonia Cafieri, Jon Lee, and Leo Liberti.

4) "semi-auxiliaries", i.e., auxiliary variables defined as  $y \ge f(x)$  or  $y \le f(x)$  instead of just y = f(x). The purpose is to save on the number of auxiliaries generated and hence on the size of the LP relaxation.

5) "Two-Implied bound tightening", a new bound reduction procedure described in <a href="http://www.optimization-online.org/DB\_FILE/2011/02/2931.pdf">http://www.optimization-online.org/DB\_FILE/2011/02/2931.pdf</a>

6) various bug fixes.

Release 0.4.0 is a snapshot of the new stable version. The new features will soon be documented in Couenne's user manual, available at <u>http://www.coin-or.org/Couenne/couenne-user-manual.pdf</u>

Happy MINLPing, Pietro

Pietro Belotti Dept. of Mathematical Sciences Clemson University email: <u>pbelott at clemson.edu</u> phone: 864-656-6765 web: myweb.clemson.edu/~pbelott



- 1. Feasibility Pump
- 2. Orbital Branching
- 3. Fixed Point BT
- 4. "semi-auxiliaries"
- 5. Two-Implied BT
- 6. various bug fixes

### COUENNE: Solving time on instances that never failed (65)

## [Couenne] Couenne stable release 0.4

Pietro Belotti <u>pbelott at clemson.edu</u> Mon Aug 8 05:13:15 EDT 2011

- Next message: [Couenne] stable/0.4 does not compile
- Messages sorted by: [ date ] [ thread ] [ subject ] [ author ]

Dear Couenne users,

this is to announce the 0.4 stable version of Couenne. There are a number of additions and improvements, including:

1) a Feasibility Pump heuristic for non-convex MINLP, developed with  ${\sf Timo}$  Berthold at the ZIB institute.

 Orbital Branching for MINLP, developed with Jim Ostrowski and Leo Liberti.

 Fixed Point Bound tightening, a bound reduction procedure developed with Sonia Cafieri, Jon Lee, and Leo Liberti.

4) "semi-auxiliaries", i.e., auxiliary variables defined as  $y \ge f(x)$  or  $y \le f(x)$  instead of just y = f(x). The purpose is to save on the number of auxiliaries generated and hence on the size of the LP relaxation.

5) "Two-Implied bound tightening", a new bound reduction procedure described in <a href="http://www.optimization-online.org/DB\_FILE/2011/02/2931.pdf">http://www.optimization-online.org/DB\_FILE/2011/02/2931.pdf</a>

6) various bug fixes.

Release 0.4.0 is a snapshot of the new stable version. The new features will soon be documented in Couenne's user manual, available at <u>http://www.coin-or.org/Couenne/couenne-user-manual.pdf</u>

Happy MINLPing, Pietro

Pietro Belotti Dept. of Mathematical Sciences Clemson University email: <u>pbelott at clemson.edu</u> phone: 864-656-6765 web: mvweb.clemson.edu/~pbelott



- Feasibility Pump feasibility\_pump no
- 2. Orbital Branching orbital\_branching no
- Fixed Point BT fixpoint\_bt 0
- 4. "semi-auxiliaries" use\_semiaux yes
- 5. Two-Implied BT two\_implied\_bt 0
- 6. various bug fixes

COUENNE: Solving time on instances solved by all (16)



Overall speedup: 2.16

### LINDO: Fails



### LINDO: Solved



LINDO 8.0: improvements in primal heuristics for MIP (feas. pump) and nonconvex NLP (multistart)

### LINDO: Found optimal solution



LINDO: Solving time on instances that never failed (72)



Overall speedup: 5.48
LINDO: Solving time on instances solved by all vers. (16)



Overall speedup: 3.02

# SCIP: Fails



## SCIP: Solved



#### SCIP: Found optimal solution



SCIP: Solving time on instances that never failed (96)



Overall speedup: 4.49

SCIP: Solving time on instances solved by all vers. (31)



Overall speedup: 2.42

# "Virtual Best" Solver

- common subset of instances
- ▶ for each instance and GAMS version, pick best results among all solvers



#### Virtual Best: Fails



Virtual Best: Solved



Virtual Best: Solving time on instances that never failed (70)



Overall speedup: 14.84



Overall speedup: 14.84

Virtual Best: Solving time on instances solved by all (17)



Overall speedup: 14.30

http://www.gamsworld.org/minlp/minlplib2/html/

Future Work:

- ▶ add more NLPs (from PrincetonLib, COCONUT, NEOS, ...)
- semi-automatic identification of duplicates
- more structure recognition, e.g., second-order cones
- define interesting subsets, especially a benchmark set for global solvers

#### Call for contributions:

- Contribute your own (MI)NLP instances! (Or send your model to minlp.org!)
- Ideally from a model for a real life problem.
- Also infeasible instances are welcomed.
- Any (well-known) format is good (e.g., AMPL, GAMS, ZIMPL, BARON, CPLEX LP, MPS, PIP, OSiL).
- MINLPLib instances are anonymized (scalar format using generic names).
- Your benefit: Solver developers may test and tune their solver for your problem.