# The SAT'03 evaluation of QBF solvers <br> Challenges in the QBF arena 

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## Why evaluating QBF solvers?

- Several QBF solvers available, becoming more and more complex (and efficient)
- QBF problems available (QBFLIB) from various area: planning, formal verification, knowledge reasoning, etc.
- No global comparison yet (local comparison on papers)
- A good way to attract people to QBF?


## The evaluation at a glance

- 11 solvers (10 complete, 1 incomplete)
- 442 benchmarks submitted
- 1278 benchmarks from www.qbflib.org
- 8 Linux boxes (PIV with 1GB RAM)
- SatEx framework
- about 1600 hours of CPU time (>60 days)


## At the end of the day(s)...

- Relative strength of solvers and state-of-the-art in solving techniques
- Classification of benchmarks according to the state-of-the-art solvers
- First (ever) quantitative assessment of QBF potential for applications
- Challenges for QBF researchers


## Benchmarks overview

- A total of 1720 benchmarks into 134 series have been run during the evaluation.
- Among these, 856 were generated according to some probabilistic model and 864 were real-world instances.
- 442 instances were submitted to the evaluation, and 1278 others were selected from QBFLIB.


## Benchmarks: format

- Prenex Clausal Normal Form
- Any QBF can be translated into PCNF
- QDimacs format
- Backward compatible with Dimacs
- 2 years old now (QBF'01, Siena)
- Rintanen's format still widely accepted


## Submitted Benchmarks

Scholl/Becker 64 benchmarks (23 proved true, 16 proved false and 25 still unsolved) in 8 series, encode equivalence checking for partial implementations problems.

Guoqiang Pan 378 benchmarks (50\% true, 50\% false) in 18 series, encode the satisfiability of modal K formulas into QBF. The original benchmarks have been proposed during the TANCS'98 comparison of theorem provers for modal logics.

| Series |  |  | Satisfi ability |  | Formulae Data |  |  |  |  |
| :--- | ---: | ---: | ---: | ---: | ---: | ---: | ---: | ---: | :---: |
| name | count | T\% | F\% | variables | clauses | sets | exist | forall |  |
| k_branch_n | 21 | $100 \%$ | $0 \%$ | 5679.05 | 28927.43 | 27.00 | 5614.67 | 64.38 |  |
| k_branch_p | 21 | $0 \%$ | $100 \%$ | 5679.05 | 28928.43 | 27.00 | 5614.67 | 64.38 |  |
| k_d4_n | 21 | $100 \%$ | $0 \%$ | 1000.90 | 3542.38 | 30.90 | 952.00 | 48.90 |  |
| k_d4_p | 21 | $0 \%$ | $0 \%$ | 694.62 | 2050.33 | 30.90 | 656.71 | 37.90 |  |
| k_dum_n | 21 | $100 \%$ | $0 \%$ | 575.86 | 1479.67 | 32.90 | 546.05 | 29.81 |  |
| k_dum_p | 21 | $0 \%$ | $100 \%$ | 486.52 | 1266.81 | 26.14 | 462.38 | 24.14 |  |
| k_grz_n | 21 | $100 \%$ | $0 \%$ | 539.76 | 1973.00 | 17.00 | 520.57 | 19.19 |  |
| k_grz_p | 21 | $0 \%$ | $100 \%$ | 520.10 | 1908.38 | 17.00 | 500.05 | 20.05 |  |
| k_lin_n | 21 | $100 \%$ | $0 \%$ | 2276.19 | 27013.90 | 8.81 | 2261.90 | 14.29 |  |
| k_lin_p | 21 | $0 \%$ | $100 \%$ | 586.24 | 3220.10 | 7.00 | 576.00 | 10.24 |  |
| k_path_n | 21 | $100 \%$ | $0 \%$ | 802.29 | 2229.76 | 27.00 | 765.29 | 37.00 |  |
| k_path_p | 21 | $0 \%$ | $100 \%$ | 736.52 | 2047.67 | 25.00 | 702.57 | 33.95 |  |
| k_ph_n | 21 | $100 \%$ | $0 \%$ | 3211.67 | 70922.62 | 4.86 | 3203.38 | 8.29 |  |
| k_ph_p | 21 | $0 \%$ | $100 \%$ | 3517.00 | 79384.52 | 4.90 | 3508.62 | 8.38 |  |
| k_poly_n | 21 | $100 \%$ | $0 \%$ | 911.14 | 2055.95 | 72.05 | 842.10 | 69.05 |  |
| k_poly_p | 21 | $0 \%$ | $100 \%$ | 909.86 | 2053.05 | 71.95 | 840.90 | 68.95 |  |
| k_t4p_n | 21 | $100 \%$ | $0 \%$ | 1603.76 | 5029.76 | 55.00 | 1528.81 | 74.95 |  |
| k_t4p_p | 21 | $0 \%$ | $100 \%$ | 908.81 | 2815.00 | 35.00 | 863.81 | 45.00 |  |
| C432 | 8 | $50 \%$ | $50 \%$ | 594.50 | 1525.00 | 6.50 | 588.00 | 6.50 |  |
| C499 | 8 | $50 \%$ | $50 \%$ | 881.50 | 2528.50 | 7.00 | 875.00 | 6.50 |  |
| C5315 | 8 | $50 \%$ | $50 \%$ | 5509.00 | 14818.25 | 10.00 | 5459.50 | 49.00 |  |
| C6288 | 8 | $50 \%$ | $50 \%$ | 4702.25 | 13798.75 | 6.00 | 4651.25 | 50.50 |  |
| C880 | 8 | $50 \%$ | $50 \%$ | 1009.00 | 2571.50 | 7.50 | 994.50 | 14.00 |  |
| comp | 8 | $50 \%$ | $50 \%$ | 299.75 | 815.25 | 4.00 | 297.25 | 2.50 |  |
| term1 | 8 | $100 \%$ | $0 \%$ | 1090.75 | 3760.25 | 8.00 | 1084.75 | 5.75 |  |
| z4ml | 8 | $100 \%$ | $0 \%$ | 63.75 | 193.00 | 3.50 | 62.25 | 1.50 |  |

Table 1: Data of submitted benchmarks.

## Benchmarks from QBFLIB

Ayari 72 benchmarks ( 35 true, 37 false) in 8 series. A family of circuit-related problems.

Castellini 169 benchmarks ( 57 true, 112 false) in 5 series. Various QBF-based encodings of the bomb-in-the-toilet planning problem.
Letz 14 benchmarks (5 true, 9 false). tree problems.

## Benchmarks from QBFLIB (2)

Narizzano/Random 836 benchmarks in 80 series.
Several QBFs randomly generated with model A proposed by Gent and Walsh.
Narizzano/Robot 120 benchmarks in 4 series.
QBF-based encoding of the "robot-on-the-grid" planning problem.
Rintanen 67 benchmarks ( 44 false, 23 false) in 9 series consisting of planning, hand made and random problems.

| Series |  | Satisfi ability |  | Formulae Data |  |  |  |  |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| name | count | T\% | F\% | variables | clauses | sets | exist | forall |
| Adder-s1 | 8 | 100\% | 0\% | 2775.00 | 3742.50 | 4.00 | 1216.50 | 667.50 |
| Adder-s2 | 8 | 100\% | 0\% | 9071.00 | 9927.50 | 6.00 | 7623.50 | 556.50 |
| Adder-u1 | 8 | 0\% | 100\% | 2791.00 | 3750.50 | 3.00 | 1556.50 | 343.50 |
| Adder-u2 | 8 | 0\% | 100\% | 9071.00 | 9919.50 | 7.00 | 7725.50 | 454.50 |
| DFlipFlop | 10 | 0\% | 100\% | 62919.50 | 82655.30 | 3.00 | 62058.50 | 37.50 |
| MutexP | 7 | 100\% | 0\% | 8890.43 | 4172.71 | 2.00 | 3078.86 | 145.14 |
| SzymanskiP | 12 | 100\% | 0\% | 82461.75 | 90270.75 | 3.00 | 72526.08 | 1786.67 |
| VonNeumann | 11 | 0\% | 100\% | 441489.00 | 643479.00 | 3.00 | 438327.00 | 240.00 |
| ToiletA-s | 21 | 100\% | 0\% | 304.00 | 4341.81 | 3.00 | 297.43 | 6.57 |
| ToiletA | 56 | 0\% | 100\% | 219.25 | 5246.98 | 3.00 | 211.61 | 7.64 |
| ToiletC-s | 29 | 100\% | 0\% | 406.03 | 2997.93 | 3.00 | 402.97 | 3.07 |
| ToiletC | 56 | 0\% | 100\% | 214.79 | 986.48 | 3.00 | 211.61 | 3.18 |
| ToiletG | 7 | 100\% | 0\% | 49.57 | 204.29 | 3.00 | 46.43 | 3.14 |
| Tree | 14 | 35\% | 65\% | 52.86 | 34.14 | 39.29 | 26.43 | 26.43 |
| Robots_D2 | 30 | 70\% | 0\% | 6422.00 | 21359.00 | 2.00 | 5172.50 | 27.50 |
| Robots_D3 | 30 | 57\% | 30\% | 6422.00 | 21360.00 | 2.00 | 5172.50 | 27.50 |
| Robots_D4 | 30 | 47\% | 53\% | 6422.00 | 21361.00 | 2.00 | 5172.50 | 27.50 |
| Robots_D5 | 30 | 47\% | 53\% | 6422.00 | 21362.00 | 2.00 | 5172.50 | 27.50 |
| Blocks-s | 4 | 100\% | 0\% | 435.75 | 5098.00 | 3.00 | 431.00 | 4.75 |
| Blocks | 9 | 0\% | 100\% | 507.11 | 7570.44 | 3.00 | 501.78 | 5.33 |
| Chain | 12 | 100\% | 0\% | 1997.50 | 11173.75 | 3.00 | 1980.00 | 17.50 |
| Impl | 10 | 100\% | 0\% | 46.00 | 90.00 | 23.00 | 35.00 | 11.00 |
| Logn | 4 | 0\% | 100\% | 1318.00 | 61599.00 | 2.00 | 1317.50 | 0.50 |
| R3cnf-s | 13 | 100\% | 0\% | 150.00 | 383.08 | 5.15 | 135.00 | 15.00 |
| R3cnf | 7 | 0\% | 100\% | 150.00 | 381.43 | 4.71 | 135.00 | 15.00 |
| Toilet-s | 5 | 100\% | 0\% | 754.80 | 3434.60 | 3.00 | 751.80 | 3.00 |
| Toilet | 3 | 0\% | 100\% | 240.33 | 869.00 | 3.00 | 238.00 | 2.33 |

## The solvers

OPENQBF by Gilles Audemard, Daniel Le Berre and Olivier Roussel.

QBFL by Florian Letombe.
QSAT by Jussi Rintanen.
QSOLVE/SSOLVE by Rainer Feldmann and Stefan Schamberger.
QUAFFLE by Lintao Zhang and Sharad Malik.
QUANTOR by Armin Biere.

## The solvers (continued)

QUBE-BJ by Massimo Narizzano, Armando Tacchella and Enrico Giunchiglia.

QUBE-REL by Massimo Narizzano, Armando Tacchella and Enrico Giunchiglia.

SEMPROP from Reinhold Letz.
walkqsat by Andrew G. D. Rowley, lan Gent, Holger Hoos and Kevin Smyth.
watchedcsbj Andrew G. D. Rowley and Ian Gent.

## Solver features

Data structure WL stands for "watched literals", a lazy data structure proposed for the Chaff architecture. CB stands for "counter based", which is the traditional (non lazy) representation of the formula.

Heuristic QO stands for "Quantifier Order", BO and MO are the Böhm's and MOMS heuristics adapted to QBF, SRC stands for "one in the smallest reduced clause".

## Solver features (2)

Pure Literal rule extended for the QBF case: if an existential literal $l$ is pure, propagate $l$, if a universal literal $l$ is pure, propagate $\neg l$.
Trivial Truth A QBF is true if its deleting all universal literals from the clauses yields a satisfiable formula.

Trivial Falsity $\Pi$ denotes that trivial falsity is detected through non tautological universal clauses, $\Sigma$ denotes that the trivial falsity is detected through the inconsistency of the CNF made of existential clauses of the matrix.

## Solver features (3)

No-good Learning the solver learns conflict-generated clauses (lemmas) during the search.

Good Learning the solver learns solutions (models) in the form of conjunctions of literals.
Unfolding universal quantifiers are unfolded using the rule $\forall x f(x)=f($ true $) \wedge f($ false $)$.
Inversion the solver applies the quantifier inversion rules. $\exists x \forall y f(x, y) \rightarrow \forall y \exists x f(x, y)$

## Chronological/Lookahead solvers

| Chronological BT | OPENQBF | QSAT | SSOLVE |
| :--- | :--- | :--- | :--- |
| data structure | CB | CB | CB |
| heuristic | QO | MO | BO |
| pure literals | yes | yes | yes |
| trivial truth | no | yes | yes |
| trivial falsity | $\Pi$ | $\Pi, \Sigma$ | $\Pi, \Sigma$ |
| unfolding | no | partial | no |
| inversion | no | yes | yes |

## Incomplete solver

| Incomplete | WALKQSAT |
| :--- | :--- |
| data structure | $?$ |
| heuristic | Walksat |
| pure literals | yes |
| trivial truth | yes* |
| trivial false | no |
| conflict BJ | yes |
| solution BJ | yes |

## Backjumping solvers

| NCB | QBFL | QUAFFLE | Q/BJ | Q/REL | SEMP | WCSBJ |
| :--- | :--- | :--- | :--- | :--- | :--- | :--- |
| data structure | CB+WL | CB | CB | CB | CB | WL |
| heuristic | BO | VS | BO | BO | SRC | $?$ |
| pure literals | yes | no | yes | yes | yes | no |
| trivial truth | yes | no | yes | yes | yes* | yes |
| trivial false | $\Pi, \Sigma$ | $\Pi, \Sigma$ | $\Pi$ | $\Pi$ | $\Pi$ | $\Pi$ |
| nogood | yes* | yes | no | yes | yes | no |
| good | no | yes | no | yes | yes | no |
| confict BJ | yes* | yes | yes | yes | yes | yes |
| solution BJ | no | yes | yes | yes | yes | yes |

## A remarquable solver: quantor

- Quote from Armin Biere:
quantor: elimination of innermost universal quantifiers by copying. This is a very preliminary version, which was put together in less than 2 person weeks. A lot of optimizations are missing.
- It is the only solver from the evaluation not based on AND/OR search!

| solver | Overall |  | Random |  |  | Non random |  |  |
| :--- | ---: | ---: | ---: | ---: | ---: | ---: | ---: | ---: |
|  | \#series | \#benchs | \#series | \#benchs | Remark | \#series | \#benchs | Remark |
| openqbf | 110 | 725 | 65 | 404 |  | 45 | 321 |  |
| qbfl | 118 | 709 | 75 | 415 |  | 43 | 294 |  |
| qsat | 130 | 1152 | 82 | 701 |  | 48 | 451 | SOTAC(22) |
| quaffe | 99 | 812 | 60 | 389 |  | 39 | 423 | SOTAC(9) |
| quantor | 64 | 456 | 19 | 115 |  | 45 | 341 |  |
| qubebj | 131 | 1383 | 82 | 842 | SOTAC(4) | 49 | 541 | SOTAC(8) |
| quberel | 133 | 1324 | 82 | 803 |  | 51 | 521 | SOTAC(12) |
| semprop | 133 | 1389 | 82 | 810 |  | 51 | 579 | SOTAC(58) |
| ssolve | 131 | 1293 | 82 | 840 | SOTAC(5) | 49 | 453 |  |
| walkqsat | 117 | 823 | 80 | 600 |  | 37 | 223 |  |
| watchedcbsj | 125 | 1004 | 80 | 602 |  | 45 | 402 | SOTAC(2) |

Table 3: Overall results of the evaluation

## Strength of solvers

- Strong solvers (>130 series): QSAT,QUBE-BJ,QUBE-REL,SEMPROP,SSOLVE
- Medium solvers: OPENQBF,QBFL, QUAFFLE, WALKQSAT,WATCHEDCSBJ
- State Of The Art Contributor: a solver being the only one to solve a problem.
- Must be noted:
- Quantor failed on random problems.
- Quaffle failed on some non random problems because of input problems.


Figure 2: Number of instances solved vs. CPU time for non-random benchmarks



## Benchmarks difficulty

- Easy: solved by all solvers (178)
- Hard: solved by no solver (142)
- Medium: solved by all "strong" solvers (862 = 1030-178)
- Smallest unsolved problem: SchollBecker (568v, 1439c, 3 alt.)
- Biggest solved problem: Ayari ( 1.3 Mv , 1.9Mc,3 alt.)


## Benchmarks difficulty

| Benchmark | \#benchs | \#Easy | \#Medium | \#Hard |
| :--- | ---: | :---: | :---: | :---: |
| Scholl/Becker | 64 | 5 | 14 | 25 |
| Guoqiang Pan | 378 | 19 | 61 | 72 |
| Ayari | 72 | 0 | 15 | 25 |
| Castellini | 169 | 115 | 30 | 0 |
| Letz | 14 | 2 | 8 | 0 |
| Narizzano/Random | 836 | 16 | 663 | 7 |
| Narizzano/Robot | 120 | 0 | 36 | 12 |
| Rintanen | 67 | 21 | 25 | 0 |

## Conclusion (personnal point of view)

- pure literals detection is important (see Quaffle)
- unlike SAT, may trigger unit propagation
- strong reason against watched literals
- strong solver have either a good lookahead (ssolve, qsat) or non chronological backtracking (both on solution and conflict)
- trivial truth looks important (all strong solvers implement it)
- is learning important?


## Challenges $1 / 3$ for benchmarks

Challenge 1 Solve the 142 hard QBF benchmarks remained unsolved during the evaluation.
Challenge 2 Random generation model that respect the polynomial hierarchy.
Challenge 3 Proving on the field that QBF-based reasoning can beat SAT-based reasoning.

## Challenges 2/3: new techniques

Challenge 4 Solution learning as enabling technology for new simplification techniques/heuristics.
Challenge 5 Conceive and experiment new simplification and intelligent backtracking techniques.
Challenge 6 Conceive and experiment new effective heuristics for QBF.
Challenge 7 Investigate the combination of technologies such as inversion of quantifiers, random sampling, partial expansion together with simplification and backtracking techniques.

## Challenges 3/3: new frontiers

Challenge 8 Build an efficient QBF solver not based on AND/OR search.
Challenge 9 Propose new techniques for randomized/incomplete QBF solvers.
Challenge 10 Build special purpose solvers, i.e., solvers tuned specifically for $k$-QBFs with $k \in\{2,3\}$

