

# Search-Space Pruning with Int-Splits

Supported by the LIT AI Lab funded by the State of Upper Austria.

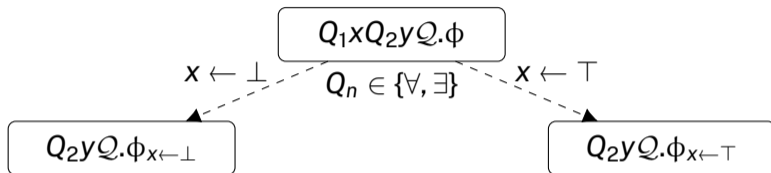


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# Divide and Conquer in QBF



# Divide and Conquer as a strong fit to QBF

QBF answers some of Divide and Conquer's biggest problems elegantly:

## Which variable to split on?

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## How deep to split?

$\log_2$  CPUs or along structures in the formula (e.g. *int-splits*)

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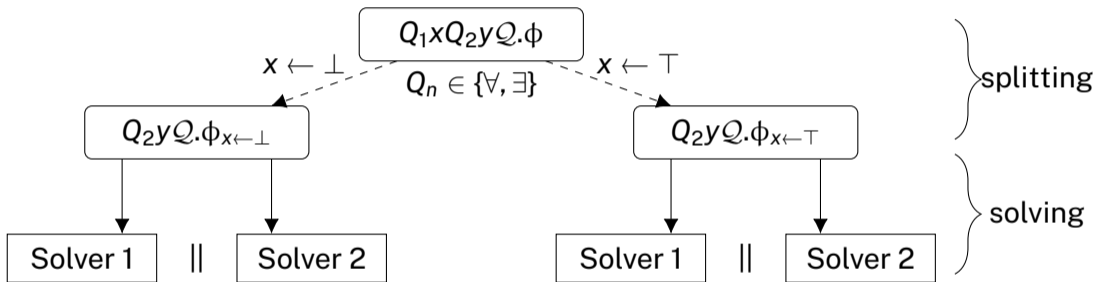
Implements *existential* and *universal* assessment functions.

Solves the formulas in the leaves of the solve tree using a portfolio of solvers, powered by QuAPI.

Monolithic solver architecture, the solver is one process (with sub-processes) that finishes and gives a SAT/UNSAT answer.



# ParaQooba Solver Structure



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*First introduced as a feature of ParaQooba at TACAS'23, then described in another paper on Arxiv and by us here.*

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The constraints  $c_i \in \{<v_i, >v_i, =V, \top\}$  restrict the domain of the quantifier  $Q_i$ . In the definition of a constraint  $v_i \in \mathbb{N}$  is a constant and  $V$  is a set of bit-vectors.



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$\varphi$  is a propositional formula in CNF over the Boolean variables of the  $\vec{x}_i$ .

# Int-Split Semantics

$$\phi = Q\vec{x}_c Q.\varphi$$

$\phi$  is true iff  $v(\phi) = 1$ , with the interpretation function  $v$  defined as follows.

$$v(\exists\vec{x}_T Q.\varphi) = 1 \text{ iff } \sum_{\sigma \in \mathcal{S}(\vec{x})} v(Q.\varphi_{\sigma(\vec{x})}) \geq 1$$

$$v(\forall\vec{x}_T Q.\varphi) = 1 \text{ iff } \prod_{\sigma \in \mathcal{S}(\vec{x})} v(Q.\varphi_{\sigma(\vec{x})}) = 1$$

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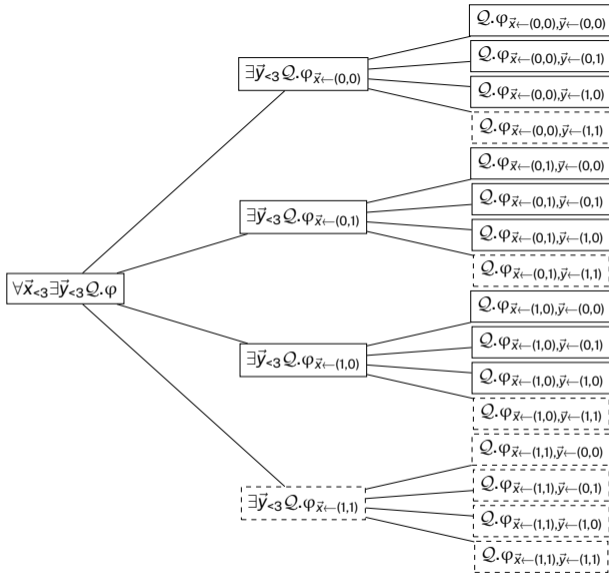
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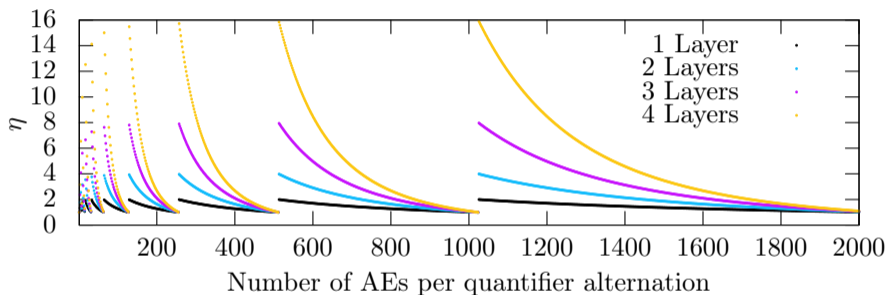
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# Int-Split Potential



Int-split efficiency  $\eta = \frac{\text{Unaccounted Expansions}}{\text{Accounted Expansions}}$  with varying number of AEs and quantifier alternations.

# QDIMACS Syntax Extension

## *Preamble and Int-Splits Entry-Point*

$\langle \text{input} \rangle ::= \langle \text{preamble} \rangle [\langle \text{prefix} \rangle] \langle \text{matrix} \rangle \text{EOF}$

$\langle \text{preamble} \rangle ::= \langle \text{comment or split} \rangle^* \langle \text{problem line} \rangle$

$\langle \text{comment or split} \rangle ::= \text{'c'} \langle \text{text} \rangle \text{EOL}$   
|  $\text{'s'} \langle \text{split} \rangle \text{EOL}$  *explicit change of formula semantics*

$\langle \text{problem line} \rangle ::= \text{'p cnf'} \langle \text{pnum} \rangle \langle \text{pnum} \rangle \text{EOL}$

# QDIMACS Syntax Extension

*Our Int-Splits Syntax Extension*

$\langle \text{split} \rangle ::= \text{int} [ \langle \text{int-split-vars} \rangle ] \langle \text{int-split-list} \rangle$

$\langle \text{int-split-vars} \rangle ::= [ \langle \text{pnum} \rangle + ]$

$\langle \text{int-split-list} \rangle ::= \langle \text{int-split} \rangle [ ; \langle \text{int-split-list} \rangle ]$

$\langle \text{int-split} \rangle ::= < \langle \text{pnum} \rangle$

|  $> \langle \text{pnum} \rangle$

|  $= \{ \langle \text{bit pattern} \rangle + \}$



# Selected Benchmarks with Int-Splits as Divide-and-Conquer Guide (Sequential Solver: Cqeq)

| Formula       | #v   | #c   | s  | u  | # <sub>w/</sub> | $\eta$ | $t_{w/}$ [h] | $t_{w/o}$ [h] | $\frac{t_{w/}}{t_{w/o}}$ | $\frac{t_{seq}}{t_{par}}$ |
|---------------|------|------|----|----|-----------------|--------|--------------|---------------|--------------------------|---------------------------|
| Hex 10 5x5-13 | 1582 | 5531 | 19 | 10 | 361             | 0.68   | 4.51         | 8.49          | 0.53                     | 47.7                      |
| Hex 02 5x5-13 | 1570 | 5437 | 19 | 10 | 361             | 0.68   | 8.33         | 14.7          | 0.57                     | 32.9                      |
| Hex 16 5x5-13 | 1550 | 5437 | 18 | 10 | 324             | 0.78   | 7.17         | 10.7          | 0.67                     | 39.1                      |
| GTTT Domino   | 943  | 3075 | 25 | 10 | 625             | 0.28   | 0.144        | 0.189         | 0.76                     | 11.6                      |
| GTTT El       | 1180 | 3951 | 25 | 10 | 625             | 0.28   | 0.265        | 0.320         | 0.83                     | 10.4                      |
| GTTT Elly     | 1465 | 5024 | 25 | 10 | 625             | 0.28   | 14.6         | 17.4          | 0.84                     | 8.59                      |
| GTTT Tic      | 1155 | 3848 | 25 | 10 | 625             | 0.28   | 0.612        | 0.726         | 0.84                     | 9.47                      |
| GTTT Tippy    | 1409 | 4799 | 25 | 10 | 625             | 0.28   | 69.2         | 77.4          | 0.89                     | 7.72                      |
| Hex 05 6x6-13 | 1812 | 5437 | 31 | 10 | 961             | 0.032  | 73.4         | 78.6          | 0.93                     | 2.47                      |

## Ongoing: Verifying Correctness

Can we verify that adding an int-split does not change the interpretation of a formula?

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Conflict between what formula authors want to express and extracting hints for solvers.

Better yet: Fully commit to changed formula semantics and extend quantifiers to support int-splits?

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Int-splits reduce problem size! But also extend QBF...which may not be ideal.

Produce solvers with int-split support and expand constraints for solvers without int-split support.

# Reference Implementation of Int-Split Formula Splitter

MIT-Licensed at:

<https://github.com/maximaximal/qdimacs-splitter>





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