

- RealPaver 1.1: A C++ Library for Constraint
- 2 Programming over Numeric or Mixed
- 3 Discrete-Continuous Domains
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#### Software

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# Summary

Constraint Programming (CP) is a paradigm for solving constraint satisfaction and optimization problems (Rossi et al., 2006). Although CP mainly addresses combinatorial problems, it can also handle continuous problems by approximating real numbers with intervals (Benhamou & Granvilliers, 2006).

RealPaver is a C++ library for CP over numeric or mixed discrete-continuous domains. Constraint Satisfaction Problems (CSPs) can be described either in C++ with the API or in a text file using the syntax of RealPaver specific language. Then, they can be solved using the C++ API or using the CSP solver from the command line. The CSP solver is pre-configured, but various parameters can be modified in another text file.

With respect to the first version of the software developed twenty years ago (Granvilliers & Benhamou, 2006), this new library incorporates new types of variables and constraints, new algorithms, a clean object-oriented architecture, the management of parameters, Meson Build as build engine (Pakkanen, 2025), an interface with third-party softwares and a C++ API. It achieves performances equivalent to the competing library lbex ("lbex-Lib," 2025) for pure continuous problems.

# Statement of need

- CP associates a rich modeling language with powerful solving techniques. The main algorithm behind the RealPaver solver is a branch-and-prune (B&P) that implements a complete search to find all the solutions of a given problem (Chabert & Jaulin, 2009; Van Hentenryck et al., 1997). The branching component separates a problem into sub-problems easier to solve. The pruning or contracting component aims at reducing the region delimited by a sub-problem. RealPaver
- This technology has been applied with success in many fields of engineering like automatic control (Jaulin et al., 2001), preliminary design (Yvars & Zimmer, 2021) and robotics (Merlet, 2004).

relies on the GAOL interval library (Goualard, 2020) to ensure rigorous computations.

This library can be used by anyone wanting to compute sets of solutions for numerical or mixed discrete-continuous constraint satisfaction problems. It can also be used to prove infeasibility or existence of solutions, thanks to the B&P algorithm and interval analysis (Moore et al., 2009). Since the library contains most of the state-of-the art algorithms relating to CP over intervals, it can also be used by researchers in this field to define new algorithms.



## Brief overview

#### Modeling language

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- There are three types of variables:
  - A boolean variable has domain {0, 1};
  - An integer variable can take values from a set of integers;
    - A real variable lies in a union of intervals.
- The language defines several types of constraints:
  - An arithmetic constraint involves the usual operations over the reals and relations from the set  $\{=, \leq, \geq\}$ ;
  - $G \to B$  is a conditional constraint, where a constraint B (body) is activated when a constraint G (guard) holds true;
    - table(X, S) is a table constraint, where X is a vector of variables and S is a set of valid assignments for X;
  - $piecewise(x, \{I_k \to C_k\}_k)$  is a piecewise constraint where a constraint  $C_k$  is activated when the variable x lies in the interval  $I_k$ .

## 53 Solving strategies

- The B&P algorithm creates a search tree by recursively dividing the initial region, i.e. the Cartesian product of variable domains. Each solving step applies a pruning of domains based on a propagation of contractors:
  - the HC4 or BC4 operators (Benhamou et al., 1999),
  - the ACID algorithm (Neveu et al., 2015),
  - the interval Newton operator for nonlinear systems of equations (Moore et al., 2009),
    - linear methods applied to affine or Taylor relaxations of nonlinear problems (Ninin et al., 2015; Trombettoni et al., 2011)
  - specific algorithms for the non-arithmetic or global constraints.
- lt uses a search strategy responsible for the selection of the next node to explore (depth-first search, breadth-first search and distant-most-depth-first search (Chenouard et al., 2009)) and the selection of a variable in this node defining the domain to be split (e.g. largest domains or the greatest impacts on the constraints (Trombettoni et al., 2011)), hence generating sub-nodes.

#### Parameters and RealPaver customization

- RealPaver integrates classes to handle three types of parameters: double-valued, integer-valued or string-valued parameters.
- All existing parameters, with their default value, are defined in the class Params. This class organizes them using 10 categories that cover all the aspects of the library.
- Moreover, the section about the parameters in the documentation (processed by MkDocs) is generated from the default parameter file, using the Python script doc/gen\_params\_doc.py.

## <sub>75</sub> Building system and requirements

The meson build system is used to orchestrate the configuration, the building of the library, and the generation of rp\_solver (the CSP solver executable). The user can select one of the supported linear solving libraries (Coin-or CLP, HiGHS, SoPlex and Gurobi) and can activate assertions, logging, or the generation of the documentation, directly as meson command line options.



- 81 The current building system does not install dependencies or third party softwares. The user
- has to install, by its own, the GAOL interval library (Goualard, 2020) and one of the supported
- linear solving libraries, as well as MkDocs if the building of the documentation is activated.

## 84 Running the solver and getting the solutions

- 85 Using the C++ API, one can use the CSPSolver class and call the solve method after having
- secreated a problem instance. Using the command-line executable rp solver, one can solve
- problems written in a text file following the RealPaver language syntax:
  - rp\_solver my\_problem.rp -p params.txt
- The -p is optional and allows customizing the parameters using a text file (here params.txt).
- By default, the summary of the solving process and all computed solutions will be stored in a
- text file, automatically named from the base file name, so my\_problem.sol in this example. A
- brief report is also displayed in the console, with the processed files, pre-processing summary,
- and solving summary (time, number of solutions, solving status, number of nodes in the search
- tree, and number of pending nodes when ending with a partial solving).

## 4 References

- Benhamou, F., Goualard, F., Granvilliers, L., & Puget, J.-F. (1999). Revising Hull and
   Box Consistency. ICLP 1999, Proceedings of the 16th International Conference on Logic
   Programming, Cambridge, MA, USA, 230–244. https://doi.org/10.7551/mitpress/4304.
   003.0024
- Benhamou, F., & Granvilliers, L. (2006). Continuous and Interval Constraints (F. Rossi, P. van Beek, & T. Walsh, Eds.; Vol. 2, pp. 571–603). Elsevier. https://doi.org/10.1016/ 51574-6526(06)80020-9
- Chabert, G., & Jaulin, L. (2009). Contractor Programming. *Artificial Intelligence*, 173, 103 1079–1100. https://doi.org/10.1016/j.artint.2009.03.002
- Chenouard, R., Goldsztejn, A., & Jermann, C. (2009). Search Strategies for an Anytime Usage of the Branch and Prune Algorithm. In C. Boutilier (Ed.), *IJCAI 2009, proceedings of the 21st international joint conference on artificial intelligence, pasadena, california, USA, 2009* (pp. 468–473). http://ijcai.org/Proceedings/09/Papers/085.pdf
- Goualard, F. (2020). GAOL (Not Just Another Interval Library). In *GitHub repository*. https://github.com/goualard-f/GAOL; GitHub.
- Granvilliers, L., & Benhamou, F. (2006). Algorithm 852: RealPaver: An Interval Solver using Constraint Satisfaction Techniques. *ACM Trans. Math. Softw.*, 32(1), 138–156. https://doi.org/10.1145/1132973.1132980
- lbex-lib. (2025). In GitHub repository. https://github.com/ibex-team/ibex-lib; GitHub.
- Jaulin, L., Kieffer, M., Didrit, O., & Walter, É. (2001). Applied Interval Analysis with
   Examples in Parameter and State Estimation, Robust Control and Robotics. Springer.
   https://doi.org/10.1007/978-1-4471-0249-6
- Merlet, J.-P. (2004). Solving the Forward Kinematics of a Gough-Type Parallel Manipulator with Interval Analysis. *The International Journal of Robotics Research*, 23(3), 221–235. https://doi.org/10.1177/0278364904039806
- Moore, R. E., Kearfott, R. B., & Cloud, M. J. (2009). *Introduction to Interval Analysis*. SIAM.
   https://doi.org/10.1137/1.9780898717716
- Neveu, B., Trombettoni, G., & Araya, I. (2015). Adaptive Constructive Interval Disjunction:
  Algorithms and Experiments. *Constraints*, 20(4), 452–467. https://doi.org/10.1007/



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#### s10601-015-9180-3

- Ninin, J., Messine, F., & Hansen, P. (2015). A Reliable Affine Relaxation Method for Global Optimization. *OR: A Quarterly Journal of Operations Research*, 13(3), 247–277. https://doi.org/10.1007/s10288-014-0269-0
- Pakkanen, J. (2025). The Meson Build system. In *GitHub repository*. https://github.com/mesonbuild/meson; GitHub.
- Rossi, F., van Beek, P., & Walsh, T. (Eds.). (2006). *Handbook of Constraint Programming* (Vol. 2). Elsevier. https://doi.org/10.1016/S1574-6526(12)70003-2
- Trombettoni, G., Araya, I., Neveu, B., & Chabert, G. (2011). Inner Regions and Interval Linearizations for Global Optimization. *Proceedings of the Twenty-Fifth AAAI Conference* on Artificial Intelligence, 99–104. https://doi.org/10.1609/aaai.v25i1.7817
- Van Hentenryck, P., McAllester, D., & Kapur, D. (1997). Solving Polynomial Systems Using a Branch and Prune Approach. *SIAM Journal on Numerical Analysis*, *34*(2), 797–827. https://doi.org/10.1137/S0036142995281504
- Yvars, P.-A., & Zimmer, L. (2021). Integration of Constraint Programming and Model-Based Approach for System Synthesis. *IEEE International Systems Conference, SysCon* 2021, Vancouver, BC, Canada, April 15 - May 15, 2021, 1–8. https://doi.org/10.1109/ SYSCON48628.2021.9447096

