

Crossroads in Constraint Programming

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I. CONSTRAINT PROGRAMMING

Constraint programming is a declarative programming paradigm exploiting techniques stemming from research on combinatorial problems in computer vision, and robot planning. The paradigm comes close to the dream that users only need to simply state a problem and the computer will solve it, as underlined in the seminal 1996 article *In Pursuit of the Holy Grail* by Eugene Freuder. The idea is that programming should be possible by simply stating the problem using a set of constraints. Using the traits of these constraints, appropriate techniques are then automatically selected and applied for solving the problem. Constraints are ubiquitous, and the requirement to satisfy them can be modeled within the framework of the *constraint satisfaction problem* (CSP). The constraints of a CSP are specified as relations on a set of variables. The choice of these variables and formulation of the constraints turns out to be essential for the efficiency of the obtained program. Many optimization problems can also be addressed with various extensions of constraint programming. Constraints whose satisfaction is optional are called *soft constraints*. They can be associated with a function that quantifies the desire for their satisfaction.

The brute force approach to combinatorial problems is usually considered to be one of either the *chronological backtracking* or the *generate and test* method. The research into constraint programming has started with work on local reasoning. Local reasoning combines a subset of the known constraints to infer new constraints. Therefore it is also known as *constraint propagation*. When a local inconsistency is inferred, the reduction in the size of the search space (Cartesian product of domains for variables) is potentially exponential. Propagation is desirable when the overhead is polynomial and promises exponential speed-up.

The propagation process is also referred to as *local consistency enforcement* since new constraints illustrate clearer what values are allowed. In general, the generation of unary constraints, i.e., removing values from domains, which has lower overhead, has been more successful in solvers, specially when repeatedly applied on subproblems during backtracking. Techniques where all applied operations result only in redundant constraints or in the splitting of the search space guarantee that no solution is lost. Those techniques guaranteeing to find a solution whenever a solution exists are said to be *complete*. Most past research has focused on complete algorithms, and this is being identified as something that may change in the near future.



Fig. 1. Freuderfest location

If one views the variables of a CSP as nodes and the constraints relating them as arcs (or hyper-arcs), the obtained *graph structure* captures essential information about the problem. It was shown by Freuder that problems whose graph structure is a tree can be solved in linear time. Other properties of the graph structure were found for which polynomial time algorithms exist. Problems that do not originally present such structures can be split or otherwise processed to reduce them to the desirable structures. Constraints that involve a large number of variables, notably those that involve a number of variables dependent on the

size of the problem, cannot be processed straightforwardly. Special propagation techniques have been developed for many types of such *global constraints*, hundreds of them being available in catalogs set up by researchers in the constraint programming community. It was observed that the structure of the CSP graphs as well as the internal structure of particular constraints presents symmetries and search on such symmetric parts is redundant, the results being directly transferable. Significant recent effort was placed on detecting and exploiting *symmetries*. The community is also exploring *distributed CSPs*, namely where some of the constraints are secrets of participants who share a desire to find values that satisfy all their constraints. The applications of CSPs have raised other research topics such as *constraint extraction* from examples or from text, and *constraint elicitation* from users. Another problem is how to provide *explanations* about which subset of the constraints could be changed to transform an insolvable problem into one that has solutions. Several centers for research into constraint programming concentrate researchers, the largest being the Cork Constraint Computation Center (4C).

II. FREUDERFEST AND CP 2011

The 17th International Conference on Principles and Practice of Constraint Programming was held in September 2011 in Perugia, Italy. Freuderfest, a special workshop dedicated to the retirement of Eugene Freuder, the founder and director of the Constraint Computation Center in Cork was held the day before the conference in the historical building of the administration of Perugia. As it was highlighted there by Francesca Rossi, Eugene has worked with 111 collaborators on 112 articles. Some of his closest collaborators were invited to speak about the impact of

his work on their research. The workshop was opened with an introduction by Barry O'Sullivan, the new director of 4C. Eugene himself used his speech to argue that the CP research community should debate more on the relevance of completeness and encouraged the intensification of research into incomplete techniques. This is a significant turn from his original focus on complete backtrack-free search and tree structures, interchangeability and symmetries. The other speakers focused on his seminal works in each of these fields, in which he is known to have launched and structured the basic ideas.

Eight collocated workshops were scheduled during the first day of the conference. Among them were the *11th Workshop on Soft Constraints* (Soft), the *8th Workshop on Local Search* (LSCS), *11th Workshop on Symmetry* (SymCon), and *10th Workshop on Modeling and Reformulation* (ModRef). There were also new workshops on *CSP based Bioinformatics* (WCB), *Component Configuration* (Lococo), *Parallel Methods* (PMCS), and on the *MiniZinc Modeling language*. The ModRef workshop organized a very popular panel on the available extensions to the common CSP representations. The discussions addressed the difficulties of extensions with Boolean Clauses, LP, MDDs and Neural Networks.

The main conference was started with an invited talk by Jean-Charles Régin on common pitfalls to avoid when solving problems with CP. His conclusion was that when CP does not work, most likely it is due to the choice of a bad representation. The Best Student Paper Award was offered to Marie Pelleau for her work on representing constraints in continuous domains using two Cartesian systems of coordinates rotated at 45 degrees. The solution intersects boxes found along those two different coordinate systems, significantly improving the approximation of complex shapes. Meinoff Sellman from IBM gave a tutorial on solver portfolios. He recommended SATzilla and CP Hydra as the best portfolio solvers for SAT and CSPs.

The Best Paper Award was offered to Georg Gottlob for proving an old conjecture about the NP-hardness of Minimal Constraint Networks. He shows

that even when a constraint problem is reduced to its minimal configuration, namely where each pair of values for any two variables that is not forbidden by any constraint appears in at least one solution, finding a solution is a hard problem.

In a premiere for CP, the invited talk by Patrick Prosser with the occasion of receiving the Research Excellence Award from the Association of Constraint Programming (ACP) was delivered using a much appreciated YouTube video. The ACP Doctoral Research Award was offered to Standa Živný, who gave a talk on the complexity and expressive power of valued CSPs. He showed that many tractable constraint languages can be obtained by composing constraints from existing languages. The doctoral students tutorial by Laurent Michel focused on the importance of careful design for experiments, factoring out the noise and caching issues with sufficiently large problem sets.

Laurent Perron from Google described a successful application of constraint programming within the most important Google servers, namely for taking caching decisions and decisions concerning the routing of user traffic. The constraint programming technique has saved 1 millisecond which translates into savings of millions of dollars given the scale of the corresponding operations at Google. Google proposed the ROADEF challenge which stresses the need for a good solution fast (no optimality and no completeness required). The challenge has deadlines in each August and February. The Best Application Paper Award was offered for a paper coauthored by Venkatesh Ramamoorthy for successfully using CSPs to design highly nonlinear cryptographic functions. Such functions are the most sensible part of modern ciphers, and resistance to known attacks requires the satisfaction of a set of constraints. No solution is known to satisfy all these constraints, but some of them are soft and solutions have been found within certain thresholds. A few of these constraints are global and their decomposition, when done without preserving completeness, enabled to find functions that better satisfy the soft constraints when compared to previously

found ones.

The conference was closed with a celebration of Gene Freuder's retirement, under the form of a panel on the future of constraint programming. Eugene stressed the importance of selecting lofty goals, launching buzzwords like: Problem solving Web, Electronic Embodiment, Computational Precognition and Business Constraints. Visible applications are in healthcare, analytics, energy, sustainability, and humanitarian operations. The researchers should balance the just-in-case redundant constraint generation tendency that challenges memory requirements for the just-in-time approach that spends resources only when needed. Approaching the lofty goals should be achieved also by broadening the scope of the CP conference which should join all research where the constraint is relevant, no longer focusing only on algorithms based on backtracking.

All the presentation slides were made available on website of the program of the conference: dmi.unipg.it/cp2011.



Fig. 2. Group picture at CP2011

Christian Bessiere is research professor at CNRS at Montpellier, France. His research has focused on constraint programming. He has published articles on all aspects of constraint programming and in particular on constraint propagation.

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