Personal information

Surname(s) / First name(s)

Address

Samulowitz, Horst

1101 Kitchawan Road Yorktown Heights, New York 10598

USA

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http://www.cs.toronto.edu/~horst

Summary

Within the Cognitive Computing department at IBM Research I am leading the automated machine learning and data science (AMLDS) group. It focuses on projects in Artificial Intelligence and Machine Learning. Topics include Meta-Learning (e.g., automated algorithm selection and configuration), interactive ML systems, combinatorial reasoning and optimization, design and analysis of efficient inference technology for probabilistic reasoning. One current project is the Cognitive Assistant for Data Scientists.

Education

09/2003-09/2007

Ph.D. Computer Science

University of Toronto, Canada

Artificial Intelligence Group

Supervisor: Prof. F. Bacchus

"Solving Quantified Boolean Formulas"

M.Sc. Computer Science

RWTH Aachen, Germany

Knowledge-Based Systems Group Supervisor: Prof. G. Lakemeyer

"Evaluation-Based Reasoning in First-

Order Knowledge Bases"

10/1997-02/2003

Work Experience since 10/2012 Research Manager and Research Scientist Cognitive Algorithms IBM TJ Watson Research Center, USA □ Building Cognitive Systems □ Artificial Intelligence for Combinatorial Search and Optimization □ Machine Learning for automated algorithm selection and configuration (e.g., automatically selecting the most suitable analytic tool) Research applied in industrial and government projects 10/2010 - 09/2012 Post-Doctoral Researcher Business Analytics and Mathematical Sciences IBM TJ Watson Research Center, USA and IBM Zürich Research Laboratory, Switzerland □ Artificial Intelligence for Combinatorial Optimization (e.g., improvement of IBM ILOG CPLEX) □ Machine Learning for automated algorithm selection and configuration Research applied in industrial projects 08/2009 - 09/2010 Researcher National ICT Australia Ltd, Australia Research Centre of Excellence □ Modeling language for search in Al algorithms Heuristic Search in Al algorithms 08/2009 - 09/2010 Researcher Fellow University of Melbourne, Australia □ Supervision of students and projects 09/2007 - 07/2009 Post-Doctoral Researcher Constraint Reasoning and Machine Learning Group Microsoft Research, England □ Online adaptive search in combinatorial algorithms Research results employed in product "Microsoft Solver Foundation" 09/2003 - 08/2007 Research Assistant

Artificial Intelligence Group

University of Toronto, Canada

□ Research in AI and Knowledge Representation

Research Group Organizer 07/2006 - 10/2006 Internship Constraint Reasoning Group Microsoft Research, England □ Stochastic Constraint Satisfaction 04/1995 - 08/2003 Software Developer and System Admin **HEWATT GmbH**, Germany □ Software Development for embedded systems □ Simulation of prototypes 05/2001 - 01/2003 Founder and CEO IT-Develop AG, Germany □ Development of a contemporary communication platform

Acquisition of funding 02/1999 - 08/2002 Research Assistant Virtual Reality Group RWTH Aachen, Germany □ Simulation of prototypes using Virtual Reality □ Parallel projection on 50+ projectors □ Exhibited at CeBIT Other Skills C#, C++, F#, Python, Java, HTML, PHP, Computer Languages SQL, Prolog, Mercury **Compute Clusters** High-Performance Compute Clusters (Microsoft Windows HPC and Linux clusters)

Patents

Collaborative Expert Portfolio Management

Spoken Languages

Microsoft Research, Cambridge, UK

English, German, Dutch fluent Spanish intermediate; French basic

Manage portfolio of experts such as automated problem solvers, algorithms, services or human experts in order to select the most appropriate expert for a given task online at a negligible cost.

Software

IBM Data Science Experience

Microsoft Solver Foundation

G12 - Constraint Reasoning Platform

QBF Solvers

Teaching, Supervision and Mentoring

Supervision Honours Project

Supervision Summer Student

Supervision Intern

Teaching Assistant

Automated Model Selection in DSX

http://datascience.ibm.com/

Contributed to the Microsoft Solver Foundation (C#)

http://www.solverfoundation.com Contributed to the G12 - Constraint Reasoning Platform (Mercury)

http://g12.research.nicta.com.au/ Developed multiple award-winning QBF solvers (C++)

http://www.cs.toronto.edu/~horst/
index_files/software.html

Titel: "Constraint-Based Local Search", University of Melbourne, 2010

Titel: "Partial Booleanization of Constraints defined in more Expressive Modelling Languages", University of Melbourne, 2010

Titel: "Using Reinforcement Learning to Dynamically Adapt Search when solving Constraint Problems", Microsoft Research, 2008

Lecture: "The How and Why of Computing (CSC 147, University of Toronto)", Topics: HTML, JAVA, Algorithms and Data Structures, Database Systems, Theory of Computation

Duties included marking assignments and exams, conducting weekly one hour classroom tutorials/lab sessions, maintaining newsgroup and also setting up assignments, tutorials, and lab questions.

Spring 2007

Mentoring

Mentoring Undergraduate and Master students at the University of Toronto, 2005-2007

Teaching Assistant

Lecture: "Introduction to Artificial Intelligence (CSC 384, University of Toronto)", Topics: What is AI?, Search (e.g., Backtracking/Game Tree Search), Knowledge Representation, Reasoning Under Uncertainty, Planning

Duties included marking assignments and exams, conducting weekly one hour classroom tutorials, office hours, and setting up assignments/exams.

Winter 2003, Spring 2004, Winter 2004, Spring 2005, Winter 2005, Spring 2006, Winter 2006

Academic Awards and Funding

Winning Entries at International SAT Competition 2011/12/13

Winner of the International QBF Competition 2006

Ph.D. Scholarship

Interest-free Loan for Start-Up

Other Skills

Computer Languages

Compute Clusters

Spoken Languages

Multiple first place; more than 10 1st,2nd,3rd ranked entries in total

http://www.satcompetition.org 1st, 2nd, and 3rd place on industrial benchmarks:

http://www.qbflib.org

 $\approx \mathit{CAD}100.000, \ \mathsf{University} \ \mathsf{of} \ \mathsf{Toronto}, \ \mathsf{2003}$

 $\approx EUR200.000,$ Sparkasse Aachen, Germany, 2001

C#, C++, F#, Python, Java, HTML, PHP, SQL, Prolog, Mercury

High-Performance Compute Clusters (Microsoft Windows HPC and Linux clusters)

English, German, Dutch fluent Spanish intermediate; French basic

Senior/Program Committee

Committee	
Senior Program Committee	International Joint Conference on Artificial Intelligence, IJCAI , 2011, 2013,2015
Program Committee	Twenty-Eight Conference on Artificial Intelligence, AAAI , 2014, 2015
Program Committee	21st European Conference on Artificial Intelligence, ECAI , 2014
Program Committee	17th International Conference on Theory and Applications of Satisfiability Testing, SAT , 2014
Program Committee	Learning and Intelligent Optimization, LION, 2010, 2012, 2013, 2014
Program Committee	International Conference on Integration of AI and OR Techniques in Constraint Programming for Combinatorial Optimization Problems, CPAIOR , 2013
Program Committee	Twenty-Sixth Conference on Artificial Intelligence, AAAI , 2012
Program Committee	Principles of Knowledge Representation and Reasoning, KR , 2012
Program Committee	Learning and Intelligent Optimization, LION 2010, 2012, 2013
Program Committee	Twenty-Fifth Conference on Artificial Intelligence, AAAI , 2011
Program Committee	Doctoral Programme in Constraint Programming, CP-DP , 2011
Program Committee	Twenty-Fourth Conference on Artificial Intelligence, AAAI , 2010
Program Committee	Doctoral Symposium on Engineering Stochastic Local Search Algorithms, 2009
Program Committee	The International Joint Conference on Artificial Intelligence, IJCAI , 2009

Twenty-Third AAAI Conference on Artifi-

Workshop on Autonomous Search at the Principles and Practice of Constraint

cial Intelligence, AAAI, 2008

Programming Conference, 2007

Program Committee

Program Committee

Reviewing

JAIR 2014

JAI

2014 **CP**

2005, 2007, 2009, 2010, 2011, 2012, 2013

CPAIOR 2010

SAT

2006, 2007, 2010, 2011, 2012

DATE 2010

Journal of Heuristics 2009

JSAT 2008, 2009

Grant Proposal 2009

Letters to Constraint Processing 2008

PhD. Proposals 2008

STAIR 2008

NESCAI 2007. 2008

AI 2007

Journal of Artificial Intelligence Research

Journal of Artificial Intelligence

International Conference on Principles and Practice of Constraint Programming

International Conference on Integration of Artificial Intelligence (AI) and Operations Research (OR) techniques in Constraint Programming

International Conference on Theory and Applications of Satisfiability Testing Design, Automation and Testing Confer-

ence

Journal of Heuristics

Journal of Satisfiability

Grant Proposal Review for the Government of Chile

Special Issue on Autonomous Search

PhD. Proposals at Microsoft Research, Cambridge

STAIR workshop at the Conference on Artificial Intelligence (AAAI)

North East Student Colloquium on Artificial Intelligence

Twentieth Australian Joint Conference on Artificial Intelligence

Talks

Siemens Research USA Princeton, 2014

IBM Austin Research Lab Austin, 2011 "Adaptive Combinatorial Search"

"Algorithm Selection and Scheduling"

IBM TJ Watson Research Lab "Automated Algorithm Selection" New York, 2011 **DOCOMO Research** "Improving Combinatorial Search" Munich, 2010 **University of Melbourne** "Design of a Lightweight Standard Melbourne, 2010 Search Language" **AAAI 2010** "Expert Portfolio Manager" Atlanta, 2010 **IBM TJ Watson Research Lab** "Improving Combinatorial Search" New York, 2010 **NICTA** "Impact-Based Search" Melbourne, 2009 **Microsoft Research** "Learning Adaptation to Solve Constraint Cambridge, 2009 Satisfaction Problems" Okinawa Institute of Science "Improving Constraint-Based Solvers" and Technology Okinawa, 2009 **LION 2009** "Learning Adaptation to Solve Constraint Satisfaction Problems" Trento, 2009 "Adaptive Search in Constraint Satisfac-**Microsoft** Seattle, 2008 tion Problems" **University of Durham** "Improving Constraint-Based Solvers" Durham, 2008 **Microsoft Research** "Improving Constraint-Based Solvers" Cambridge, 2007 **ETH Zürich** "Improving Constraint-Based Solvers" Zürich, 2007 **AAAI 2007** "Learning to Solve QBF" Vancouver, 2007 **University of Toronto** "Solving Quantified Boolean Formulas" Toronto, 2007 **SAT 2007** "Dynamically Partitioning for Solving Lissabon, 2007 QBF" Microsoft Research "Improving Search" Cambridge, 2007 **University of Toronto** "Propositional Satisfiability" Toronto, 2006

Cornell University, 2006

CP 2006

mulas"

"Using SAT in QBF"

Nantes, 2006

NESCAI 2006

"Preprocessing Quantified Boolean For-

NESCAI 2006

Cornell University, 2006

Microsoft Research

Cambridge, 2006

CP 2005

Sitges, 2005

University of Toronto Toronto, 2003

RWTH Aachen

Aachen, 2003

Dagstuhl Seminar Dagstuhl, 1999 "Preprocessing QBF"

"Stochastic Constraint Satisfaction"

"Using SAT in QBF"

"Efficient Reasoning in First-Order Knowledge Bases"

"Evaluation-Based Reasoning in First-Order Knowledge Bases"

"Visualization of Eclipses and Planetary Conjunction Events: The Interplay between Model Coherence, Scaling and Animation"

List of Taken Graduate Courses

Master of Science	☐ IMAGE PROCESSING AND COM PUTER GRAPHICS
Department of Computer Science	☐ PERFORMANCE OF COMPUTER COMMUNICATION
RWTH Aachen	☐ INTRODUCTION TO AI
Germany	☐ EFFICIENT ALGORITHM DESIGN
	☐ OPERATING SYSTEMS
	□ DATABASES
	□ LOGIC OF KNOWLEDGE BASES
	☐ LOGIC PROGRAMMING
	☐ INTERNET TECHNOLOGY
Doctor of Philosophy	□COMPUTABILITY AND LOGIC (Steve Cook)
Department of Computer Science	☐ MACHINE LEARNING AND NEURAL
	NETS (Richard Zemel)
University of Toronto	☐ CONSTRAINT SATISFACTION PROBLEMS (Fahiem Bacchus)
Canada	□ TOPICS IN GRAPH THEORY (COM PUTATIONAL BIOLOGY) (Michae Brudno)

References

Fahiem Bacchus, Professor

Department of Computer Science

University of Toronto

Toronto, ON M5S 3G4, Canada Email: fbacchus@cs.toronto.edu Website: http://www.cs.toronto.edu/

~fbacchus/

Ralf Herbrich, Manager

Microsoft Research

United Kingdom

Email: rherb@microsoft.com

Website: http://research.microsoft.

com/en-us/people/rherb

Gerhard Lakemeyer, Professor

RWTH Aachen

Department of Computer Science Knowledge-Based Systems Group

Aachen, 52056

Email:

gerhard@informatik.rwth-aachen.de
Website: http://www-i5.informatik.

rwth-aachen.de/gerhard/

Hector Levesque, Professor

Department of Computer Science

University of Toronto

Toronto, ON M5S 3G4, Canada Email: hector@cs.toronto.edu

Website: http://www.cs.toronto.edu/

~hector/

Michael Brudno, Professor

Department of Computer Science and

Computational Biology

University of Toronto

Toronto, ON M5S 3G4, Canada Email: brudno@cs.toronto.edu

Website: http://www.cs.toronto.edu/

~brudno/

Refereed Publications

Cognito: Automated Feature Engineering for Supervised Learning

[ICDM-DEMO], 2016

Adaptive data augmentation for image classification

[ICIP], 2016

Deep Learning for Algorithm Portfolios

[AAAI], 2016

Near-Optimal Training Data Allocation With Bounded Regret

[AAAI], 2016

Model-based Genetic Algorithms for Algorithm Configuration

[IJCAI], 2015

Towards Cognitive Automation of Data Science

[AAAI-DEMO], 2015

Insights into Parallelism with Intensive Knowledge Sharing

[CP], 2014

Parallel Combinatorial Optimization with Decision Diagrams

[CPAIOR], 2014

Udayan Khurana, Horst Samulowitz, Deepak Turaga, Srinivasan Parthasrathy

IEEE International Conference on Data Mining

Alhussein Fawzi, Horst Samulowitz, Deepak Turaga, Pascal Frossard International Conference on Image Processing

Andrea Loreggia, Yuri Malitsky, Horst Samulowitz, Vijay Saraswat

29th AAAI Conference on Artificial Intelligence

Ashish Sabharwal, Horst Samulowitz, Gerry Tesauro

29th AAAI Conference on Artificial Intelligence

Carlos Ansotegui-Gil, Yuri Malitsky, Horst Samulowitz, Meinolf Sellmann, Kevin Tierney

24th International Joint Conference on Artificial Intelligence

Horst Samulowitz, Gerry Tesauro, Deepak Turaga, Alain Bliem, Yuri Malitsky, Chandra Reddy, Tim Klinger, Anton Riabov, Daby Sow, Mark Feblowitz

Demonstration Track at the 28th AAAI Conference on Artificial Intelligence Ashish Sabharwal, Horst Samulowitz

20th International Conference on Principles and Practice of Constraint Programming (CP)

David Bergman, Andre Cire, Ashish Sabharwal, Horst Samulowitz, Vijay Saraswat, Willem-Jan van Hoeve

11th International Conference on Integration of AI and OR Techniques in Constraint Programming Resolution and Parallelizability: Barriers to the Efficient Parallelization of SAT Solvers

[AAAI], 2013

Algorithm Portfolios Based on Cost-Sensitive Hierarchical Clustering

[IJCAI], 2013

Snappy: A Simple Algorithm Portfolio (Tool-Paper)

[SAT], 2013

Search Combinators

[Constraints Journal], 2013

Stronger Inference Through Implied Literals From Conflicts and Knapsack Covers

[CPAIOR2013], 2013

SatX10: A Scalable Plug&Play Parallel SAT Framework (Tool-Paper)

[SAT2012], 2012

Learning Back-Clauses in SAT

[SAT2012], 2012

Augmenting Clause Learning with Implied Literals

[SAT2012], 2012

George Katsirelos, Ashish Sabharwal, Horst Samulowitz, Laurent Simon

27th AAAI Conference on Artificial Intelligence

Yuri Malitsky, Ashish Sabharwal, Horst Samulowitz, Meinolf Sellmann

23rd International Joint Conference on Artificial Intelligence

Horst Samulowitz, Chandra Reddy, Ashish Sabharwal, Meinolf Sellmann 16th International Conference on Theory and Applications of Satisfiability Testing Tom Schrijvers, Guido Tack, Pieter Wuille, Horst Samulowitz, Peter Stuckey Constraints Journal, Special Issue on Modeling and Reformulation

Tobias Achterberg, Ashish Sabharwal, Horst Samulowitz

10th International Conference on Integration of AI and OR Techniques in Constraint Programming for Combinatorial Optimization Problems (CPAIOR)

Bard Bloom, David Grove, Benjamin Herta, Vijay Saraswat, Ashish Sabharwal, Horst Samulowitz

15th International Conference on Theory and Applications of Satisfiability Testing (SAT2012)

Ashish Sabharwal, Horst Samulowitz, and Meinolf Sellmann

15th International Conference on Theory and Applications of Satisfiability Testing (SAT2012)

Arie Matsliah, Ashish Sabharwal, and Horst Samulowitz

15th International Conference on Theory and Applications of Satisfiability Testing (SAT2012)

Boosting Sequential Satisfiability Solver Portfolios through Knowledge Sharing and Accuracy Prediction

[LION], 2013

Parallel SAT Solver Selection and Scheduling

[CP2012], 2012

Guiding Combinatorial Optimization with UCT

[CPAIOR2012], 2012

Scheduling for Algorithm Portfolios

[CP2011a], 2011

Search Combinators

[CP2011b], 2011

Non-Model-Based Algorithm Portfolios for SAT

[SAT2011], 2011

Collaborative Portfolio Manager

[AAAI2010], 2010

Experiments with Massively Parallel Constraint Solving

[IJCAI2009], 2009

Learning to Solve QBF

[AAAI2007], 2007

Yuri Malitsky, Ashish Sabharwal, Meinolf Sellmann, Horst Samulowitz

Learning and Intelligent OptimizatioN Conference

Yuri Malitsky, Ashish Sabharwal, Meinolf Sellmann, Horst Samulowitz

18th International Conference on Principles and Practice of Constraint Programming

Ashish Sabharwal, Horst Samulowitz

9th international on Integration of AI and OR in Constraint Programming

Yuri Malitsky, Ashish Sabharwal, Meinolf Sellmann, Horst Samulowitz

17th International Conference Principles and Practice of Constraint Programming (CP)

Tom Schrijvers, Guido Tack, Pieter Wuille, Horst Samulowitz, Peter Stuckey 17th International Conference on Principles and Practice of Constraint Programming (CP)

Yuri Malitsky, Ashish Sabharwal, Meinolf Sellmann, Horst Samulowitz

Fourteenth International Conference on Theory and Applications of Satisfiability Testing (SAT2011)

David Stern, Horst Samulowitz, Luca Pulina, Armando Tacchella, Ralf Herbrich, Thore Graepel

The Twenty-Fourth AAAI Conference on Artificial Intelligence (AAAI2010)

Lucas Bordeaux, Youssef Hamadi, Horst Samulowitz

International Joint Conference on Artificial Intelligence (IJCAI2009)

Horst Samulowitz, Roland Memisevic

The Twenty- Second AAAI Conference on Artificial Intelligence (AAAI2007)

Dynamically Partitioning for Solving QBF

[SAT2007], 2007

On the Stochastic Constraint Satisfaction Framework

[SAC2007], 2007

Iterated Expressions in Constraint Programming

[JFPC2007], 2007

Preprocessing QBF

[CP2006], 2006

Binary Clause Reasoning in QBF

[SAT2006], 2006

Using SAT in QBF

[CP2005], 2001

Visualization of eclipses and planetary conjunction events. The interplay between model coherence, scaling and animation.

[JVC2001], 2001

3D-Visualization of Music

[GI2001], 2001

Visualization of eclipses and planetary conjunction events. The interplay between model coherence, scaling and animation.

Horst Samulowitz, Fahiem Bacchus

Tenth International Conference on Theory and Applications of Satisfiability Testing (SAT2007)

Lucas Bordeaux, Horst Samulowitz

The 22nd Annual ACM Symposium on Applied Computing (SAC2007)

Lucas Bordeaux, Youssef Hamadi, Claude-Guy Quimper, and Horst Samulowitz

In Proceedings of Troisime Journes Francophones de Programmation par Contraintes (JFPC2007)

Horst Samulowitz, Jessica Davies, Fahiem Bacchus

12th International Conference on Principles and Practice of Constraint Programming (CP2006)

Horst Samulowitz, Fahiem Bacchus

Ninth International Conference on Theory and Applications of Satisfiability Testing (SAT2006)

Horst Samulowitz, Fahiem Bacchus 11th International Conference on Principles and Practice of Constraint Programming (CP2006)

Walter Oberschelp, Alexander Hornung, Horst Samulowitz

The Visual Computer, Vol. 17(5)
Alexander Hornung, Horst Samulowitz
German Society for Computer Science
(GI), Computer Science Days
Walter Oberschelp, Alexander Hornung,
Horst Samulowitz

[CGI2000], 2000

Computer Graphics International (CGI2001)

Refereed Workshop Publications

Automating Feature Engineering

[NIPS-AI4DS], 2016

Cognitive Automation of Data Science

[ICML-AUTOML], 2014

An Introduction to Search

Combinators

[LOPSTR], 2012

Search Combinators for MiniZinc

[MZN2011], 2011

Guiding Combinatorial Optimization with UCT

[ICAPS2011], 2011

Memoizing a Monadic Mixin DSL

[WFLP2011], 2011

Towards a Lightweight Standard Search Language

[MODREF10], 2010

Learning Adaptation to Solve Constraint Problems

Udayan Khurana, Fatemeh Nargesian, Horst Samulowitz, Elias Khalil and Deepak Turaga

Al for Data Science Workshop at NIPS 2016

Horst Samulowitz, Ashish Sabharwal, Chandra Reddy

Auto-ML Workshop at ICML 2014

Tom Schrijvers, Pieter Wuille, Horst Samulowitz, Guido Tack, Peter Stuckey

22nd International Symposium on Logic-Based Program Synthesis and Transformation

Tom Schrijvers, Pieter Wuille, Horst Samulowitz, Guido Tack, Peter Stuckey

Minizinc Workshop (MZN2011) at the Seventeenth International Conference on Principles and Practice of Constraint Programming (CP 2011)

Ashish Sabharwal, Horst Samulowitz

ICAPS Monte Carlo Tree Search (MCTS2011) Workshop

Tom Schrijvers, Guido Tack, Pieter Wuille, Horst Samulowitz, Peter Stuckey 20th International Workshop on Functional and (Constraint) Logic Programming (WFLP)

Horst Samulowitz, Guido Tack, Julien Fischer, Peter Stuckey, Mark Wallace 9th International Workshop on Constraint Modelling and Reformulation (ModRef)

Yuehua Xu, David Stern, Horst Samulowitz

[LION09], 2009

Learning and Intelligent OptimizatioN (LION)

Other Refereed Work

Automated Design of Search with Composability

[AAAI2013], 2013

Solution Backtracking for #SAT

[NESCAI2007], 2007

Using SAT in QBF [NESCAl2006], 2006

Preprocessing QBF [NESCAI2006], 2006

Horst Samulowitz, Ashish Sabharwal, Tom Schrijvers, Guido Tack, Pieter Wuille, Peter Stuckey

27th AAAI Conference on Artificial Intelligence

Jessica Davies, Eric Hsu, Horst Samulowitz

North East Student Colloquium on Artificial Intelligence (NESCAI)

Horst Samulowitz, Fahiem Bacchus North East Student Colloquium on Artificial Intelligence (NESCAI)

Horst Samulowitz, Fahiem Bacchus North East Student Colloquium on Artificial Intelligence (NESCAI)

Thesis

Solving Quantified Boolean Formulas

[PHD], 2008

The Efficiency and Implementation of an Evaluation-Based Reasoning Procedure with Disjunctive Information in First-Order Knowledge Bases

[MSC], 2003

Horst Samulowitz

PhD Thesis, University of Toronto, 2008 Horst Samulowitz

Master Thesis, RWTH Aachen, 2003