

			FORM Personal I PAI	Data Form		Date	2018/09) /17
Family name			Given name		Initial(s) of	all given names Persor	al identifica	tion no. (PIN)
Seltzer			Margo		MI 5			42742
I hold (comp	a faculty positi lete Appendice	on at an eligible Can es B1 and C)	adian college			· · ·		
Canac	lian postsecon	old an academic appointed an academic appointed and a second approximation and a second approximation approxim				other than a Canadian p ss in Appendix A)	ostseconda	ary
		STSECONDARY	INSTITUTION					
Title of position Professor	1			Tenured or te		Yes X	No	
Department				academic ap	pointment			
Computer S	Science			Part-time app	pointment	Full-time appo	pintment	X
Campus				 For all no 	n-tenured or	non tenure-track acade complete Appendices B	mic appoin	tment and
Canadian posts British Col		itution			ne Emeritus	Professor and part-time		complete
ACADEMIC	BACKGROU	IND						
Degree		of discipline	Insti	ution		Country		Date
_		-	Homeond Huiseonsites			-	r	yyyy/mm
Bachelor's	Applied N	Iathematics	Harvard University		UNITED STATES 198			1983 / 6
Doctorate	Doctorate Computer Science		University of California - Berkeley		eley	UNITED STATES		1992/12
TRAINING C	F HIGHLY C	UALIFIED PERS	ONNEL		ł			
Indicate the nu	mber of studer	nts, fellows and other	research personnel that	you:				
		С	urrently			ast six years e current year)		
		Supervised	Co-supervised	Supe	rvised	Co-supervised	1	Fotal
Undergradua	ate			1	0	7		17
Master's	Master's							
Doctoral		4		6	2		12	
Postdoctoral			2		2			4
Others		1			2			3
Total		1	6	2	20	9		36

	Personal identification no. (PIN) 542742	Family name Seltzer		
	TRIAL EXPERIENCE (use one additional pa		Period (yyyy/mm	
Position held (begin with current)	Organization	Department	to yyyy/mm)	
Professor	British Columbia	Computer Science	2018/09	
Architect	Oracle Corporation	Oracle Labs	2012/01	
Architect	Oracle Corporation	Embedded Systems	2006/03 to 2011/12	
Harvard College Professor	Harvard University	Computer Science	2005/07 to 2010/06	
Associate Dean of Computer Science and Engineering	Harvard University	Div. of Engineering and Applied Sciences	2002/07 to 2006/07	
Professor	Harvard University	Computer Science	2000/07 to 2018/08	
Associate Professor	Harvard University	Computer Science	2000/06 to 1997/07	
Assistant Professor	Harvard University	Computer Science	1993/01 to 1997/06	
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Personal identification no. (PIN)

Family name

		542742		Seltzer	
RESEARCH SUPPORT					Years of
Family name and initial(s) of applicant		proposal, funding source and prog d time commitment (hours/month)	ıram,	Amount per year	tenure (yyyy)
List all sources of support (including NS past four (4) years but now completed; b) funding directly applicable to your research	support currently	held, and c) support applied for. For g			
a) Support held in the past 4 ye	ars				
Margo Seltzer and two others	Workload-A Optimal Per National scie	m: Collaborative Research: ware Storage Architectures formance and Energy Efficie ence foundation (US) ystems Research 10 ho	for	124,375(100%) 142,478(100%) 65,023(100%) 65,023(100%)	2014 2015 2016 2017
Margo Seltzer and two others	documentati	ence Foundation (US)	nd ours/month	137,988(100%) 126,025(100%) 126,025(100%)	2015 2016 2017
Margo Seltzer		iches for Ranking in Machin rsity (subcontract) 8 ho	ne Learnin _i burs/month	64,697(100%)	2018
Margo Seltzer with one other		AIR Digital Ecosystem in th titutes of Health (NIH) 1 ho	ne Cloud ours/month	841,387 (0%)	2018

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Personal identification no. (PIN)

Family name

		reisonal identification no. (FIN)	Family name		
		542742		Seltzer	
RESEARCH SUPPORT					
Family name and initial(s) of applicant		proposal, funding source and progra d time commitment (hours/month)	ım,	Amount per year	Years o tenure (yyyy)
List all sources of support (including NSI past four (4) years but now completed; b) funding directly applicable to your researc	support currently	held, and c) support applied for. For gro			
a) Support held in the past 4 ye	ars				
Margo Seltzer	1	ystems Laboratory 160 hour	rs/month	70,000(100%) 70,000(100%) 70,000(100%) 70,000(100%) 70,000(100%)	2019 2020 2021 2022 2023
b) Support currently held Margo Seltzer and two others	Automatical National Sci	CCA: Collaborative Researce ly Scalable Computation ence Foundation (US) Parallelism and Scalability 4 hour	ch: rs/month	149,500(100%) 133,926 (90%) 294,151 (50%) 127,211 (20%) 127,211 (20%)	2015 2016 2017 2018 2019
Margo Seltzer and one other	Intent Comn	, ,	Survival	248,586 (75%) 323,960 (75%) 537,986 (75%) 553,667 (75%)	2016 2017 2018 2019
Margo Seltzer and three others	Research: Ba Scientists National Sci	ringing End-to-End Provenan ence Foundation (US) Software Infrastructure		560,473(100%) 633,064(100%) 328,004(100%) 328,004(100%)	2016 2017 2018 2019

		Personal identification no. (PIN)	Family nam	ne	
		542742		Seltzer	
RESEARCH SUPPORT					
Family name and initial(s) of applicant		proposal, funding source and progra d time commitment (hours/month)	am,	Amount per year	Years of tenure (yyyy)
List all sources of support (including NSE past four (4) years but now completed; b) funding directly applicable to your researc	support currently	held, and c) support applied for. For gro			
b) Support currently held					
Margo Seltzer	Computer Sy Canada 150 Canada 150	Research Chair Program	rs/month	1,000,000(100%) 1,000,000(100%) 1,000,000(100%) 1,000,000(100%) 1,000,000(100%)	2020 2021 2022
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Canada (2009 W),

Highly Qualified Personnel (HQP)

Provide personal data about the HQP that you currently, or over the past six years, have supervised or co-supervised.

			Personal identification no. (PIN)	amily name
			542742	Seltzer
Name	Type of HQP Training and Status	Years Supervised or Co-supervised	Title of Project or Thesis	Present Position
(Name withheld)	Res. Associate	Supervised 2017 -	Detecting and displaying controversy in wikipedia articles	Research associate
(Name withheld)	Postdoctoral	Co-supervised 2017 -	Optimal linear models	Post doctoral fellow
(Name withheld)	Doctoral (In Progress)	Co-supervised 2016 -	Provenance-based intrusion detection	Intern, University of Cambridge
(Name withheld)	Doctoral (In Progress)	Co-supervised 2016 -	Provenance-based OS synthesis	PhD student
(Name withheld)	Postdoctoral	Co-supervised 2016 -	Domain specific languages for O synthesis	S Post-doctoral researcher
(Name withheld)	Doctoral (In Progress)	Co-supervised 2015 -	Synthesizing assemblers and linkers	PhD Student
(Name withheld)	Doctoral (In Progress)	Co-supervised 2013 -	Automatic program repair	PhD Student
(Name withheld)	Undergraduate (Completed)	Co-supervised 2017 - 2018	Coding BetteR: Assessing and Improving Reproducibility	Engineer, Uber
(Name withheld)	Res. Associate	Supervised 2017 - 2018	OS Code synthesis	PhD Student, NYU
(Name withheld)	Doctoral (In Progress)	Supervised 2017 - 2018	OS Code synthesis	PhD Student, Harvard
(Name withheld)	Undergraduate (Completed)	Co-supervised 2017 - 2018	Generating Tests to Verify Machine Descriptions	Engineer, Google
(Name withheld)	Res. Associate (Completed)	Supervised 2016 - 2018	Incorporating provenance in dataverse	Engineer, Wave
(Name withheld)	Undergraduate (Completed)	A	Simulation of open quantum systems	PhD student, Stanford
(Name withheld)	Doctoral (Not Completed)	Supervised 2011 - 2018	Automatically Scalable Computation	On leave
(Name withheld)	Undergraduate (Not Completed)	Supervised 2017 - 2017	OS Code Synthesis	deceased
(Name withheld)	Doctoral (In Progress)	Supervised 2016 - 2017	Certifiably optimal rule lists	PhD student (changed areas)
(Name withheld)	Undergraduate (Completed)	Supervised 2016 - 2017	Bias in Wikipedia articles of computer scientists	Engineer, Facebook
(Name withheld)	Undergraduate (Completed)	Supervised 2016 - 2017	Unsandboxing	Engineer, Microsoft
(Name withheld)	Undergraduate (Completed)	Co-supervised 2016 - 2017	Gender and Computer science at Harvard	Product Manager, Google
(Name withheld)	Undergraduate (Completed)	Co-supervised 2016 - 2017	Creating an Accessible Network Life-Saving Devices	of Engineer

Canadä

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Highly Qualified Personnel (HQP)

Provide personal data about the HQP that you currently, or over the past six years, have supervised or co-supervised.

			Personal identification no. (PIN)	Family name
			542742	Seltzer
Name	Type of HQP Training and Status	Years Supervised or Co-supervised	Title of Project or Thesis	Present Position
(Name withheld)	Undergraduate (Completed)	Supervised 2016 - 2017	More Automatically Scalable Computation	PhD Student, Stanford
(Name withheld)	Undergraduate (Completed)	Supervised 2016 - 2017	A Case for Discrete Optimizati in the 21st Century	on Engineer, Benevolent AI
(Name withheld)	Postdoctoral	Supervised 2016 - 2017	Whole system provenance	Lecturer, University of Bristol
(Name withheld)	Undergraduate (In Progress)	Supervised 2016 - 2017	Incorporating provenance into Dataverse	Undergraduate student (senior)
(Name withheld)	Doctoral (Completed)	Supervised 2008 - 2017	Sorting shapes the performance graph-structured systems	e of Senior engineer, Google
(Name withheld)	Undergraduate (Completed)	Co-supervised 2015 - 2016	Community Attribute Models v Dynamic Graph Evolution	ia Quantitative trader, Jane Street Capital
(Name withheld)	Undergraduate (Completed)	Supervised 2015 - 2016	Using Gaussian Processes to fin predictable points in progs	nd Software engineer, Facebook
(Name withheld)	Undergraduate (Completed)	Supervised 2013 - 2015	Data structures for fast lookup large, sparse bit vectors	on Software engineer, Microsoft
(Name withheld)	Undergraduate (Completed)	Supervised 2013 - 2015	Data structures for fast lookup large, sparse bit vectors	on PhD Student, Harvard
(Name withheld)	Doctoral (Completed)	Supervised 2008 - 2015	LLAMA: A Persistent, Mutable Representation for Graphs	e Member of the technical staff, NetApp
(Name withheld)	Undergraduate (Completed)	Supervised 2013 - 2014	Evaluating the efficacy of a flip classroom for OS course	oped Software engineer, Facebook
(Name withheld)	Doctoral (Completed)	Co-supervised 2011 - 2014	Accelerating Markov chain Mo Carlo via parallel predictiv	nte Independent
(Name withheld)	Doctoral (Completed)	Supervised 2004 - 2014	Limiting Disclosure in Annotat Graphs	ed CEO, Sybil Security
(Name withheld)	Undergraduate (Completed)	Co-supervised 2013 - 2013	Evaluating the efficacy of style evaluation in a Mooc	Software engineer, Asana
(Name withheld)	Postdoctoral	Supervised 2010 - 2012	Hypervisor based provenance collection	Senior Performance Engineer, Mark Logic
(Name withheld)	Doctoral (Completed)	Co-supervised 2010 - 2012	Coordinated Resource Management in Network	Assistant Professor, Vassar

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1. Most Significant Contributions to Research and/or Practical Applications

Data Provenance is the formal record of how a data item came to be in its current state. It includes the identification of input data sources and the transformations of those sources into an artifact. It is widely accepted that data provenance lies at the heart of reproducibility.

Seltzer is a pioneer in this area. Her three most significant contributions in this area are: 1) the categorization and definition of the two modes of provenance collection: observation and disclosure [1], 2) the concept and implementation of whole-system provenance [2], and 3) the concept and implementation of semantic integration of provenance via layering [3]. First generation research in data provenance focused on mechanisms for capturing provenance, however, adoption requires applications that use provenance. Seltzer's recent work in this area focuses on applications of provenance: intrusion detection [6,16], other security applications, such as data loss prevention and attack attribution [5], computational reproducibility [7], and regulatory compliance [12].

Automatically Scalable Computation: Since the creation of the first multiprocessor computer system, a grand challenge has been the quest to "magically" transform a single-threaded program into a parallel one. The Automatically Scalable Computation (ASC) [27] project is a collaboration between Harvard and Boston University to achieve this vision, by transforming the problem of parallelization into a problem of prediction and speculation.

We assume a computational model based upon dynamical systems. The registers and memory of a conventional single-threaded processor comprise a (very large) state space. Instruction corresponds to a step in the state space, and program execution out a trajectory in that space. We find points in that trajectory from which we can build models that will accurately predict future states that the program will encounter. We then use excess cores to speculatively execute from those predicted states. If our predictions were accurate, the speculative executions can be used when we later encounter the predicted state from which they started, by fast forwarding to the end state of the speculation thereby achieving speedup.

Seltzer's group has produced two systems that embody this approach. The first realization of this architecture used a software virtual machine that emulated a subset of the Intel x86-32 architecture [31]. It demonstrated linear scalability up to hundreds of cores on a small collection of computational kernels. The second realization runs natively on Intel hardware, producing real-time speedup on a 44-core machine. On the kernels that it can effectively predict (the vast majority of the Polybench kernels), its performance is limited only by the overhead of the tools that monitor program execution. The team has proposals for new hardware to make monitoring more efficient.

This project spawned work in a number of disciplines. Early in the project's history, one of Seltzer's students (Elaine Angelino) used the idea of computational reuse and speculation for predictive prefetching for Markov Chain Monte Carlo simulation [24]. Using similar techniques, Seltzer's student, Amos Waterland, teamed up with colleagues in Applied Physics to apply ASC-like techniques to long timescale simulation of the atomistic evolution of materials, producing a paper in the Journal of Chemical Theory and Computation [4]. At Boston University, theorist Steve Homer has been developing a framework that defines the program properties that make an implementation amenable to ASC parallelization.

Efficient and Interpretable Models: In joint work with Cynthia Rudin, Seltzer has been developing high-performance implementations for interpretable models, e.g., rule lists, decision trees. In a series of conference and longer papers on constructing rule lists, Seltzer and her team have demonstrated how combining systems' techniques with strong mathematical bounds allows for solution of previously intractable problems.

Building on the idea of computational reuse, introduced in the ASC project, Seltzer developed a way to reuse computation in the Bayesian Rule List setting. Bayesian Rule Lists use Markov Chain Monte Carlo. However, any two consecutive rule list evaluations are quite similar. Storing incremental results for these evaluations produces an order of magnitude speedup. Tighter mathematical bounds on the objective function also improve performance significantly. To support these computations, Seltzer developed a high-performance library for rule list evaluations; this resulted in another order of magnitude performance improvement. This work, Scalable Rule Lists, won a best student paper award at the 2016 AISTATS conference and was then published in the 2017 ICML conference [14].

Building on this combination of computational reuse and clever data structures, Seltzer and Rudin moved on to the challenge of constructing a rule list for which they could produce a certificate of optimality. CORELS (Certifiably Optimal RulE ListS), uses a branch and bound algorithm to produce on optimal rule list with respect to a regularized objective function [10,15]. Once again, mathematical bounds played a significant role in reducing the search space, and computational reuse makes the implementation more efficient. Additionally, CORELS uses a collection of clever and efficient data structures to manage the algorithm. One of the more important such additions, conceived of by Seltzer, is the symmetry aware map. The key insight is that all orderings of a particular set of rules will *capture* the same samples from the training data. (A rule captures a sample if it is the first rule in the list for which the sample evaluates to true. The set of all samples captured by a sequence of rules is said to be captured by that sequence.) Thus, only the best performing permutation of a set of rules needs to be kept; all other permutations can be pruned. This again greatly reduces the search space.

The code for both projects is available under an open source license. SBRL has already been used by hundreds of researchers; CORELS was released in August 2017.

Seltzer's references prior to 2013 appear here as do references to others' work; Seltzer's post-2013 publications appear in the following section.

- 1. Braun, U., Garfinkel, S., Holland, D., Muniswamy-Reddy, K., Seltzer, M., "Issues in Automatic Provenance Collection," *Proceedings of the 2006 International Provenance and Annotation Workshop (IPAW)*, Chicago, IL, May 2006.
- 2. Muniswamy-Reddy, K., Holland, D., Braun, U., Seltzer, M., "Provenance-Aware Storage Systems," *Proceedings of the 2006 USENIX Annual Technical Conference*, Boston, MA, June 2006.
- Muniswamy-Reddy, K., Braun, U., Holland, D., Macko, P., Maclean, D., Margo, D., Seltzer, M., Smogor, R., "Layering in Provenance Systems," *Proceedings of the 2009 USENIX Annual Technical Conference*, San Diego, CA, June 2009.
- 4. Perez, D., Cubuk, E., Waterland, A., Kaxiras, E. Voter, A., "Long-time dynamics through parallel trajectory splicing," *Journal of Chemical Theory and Computation (JCTC)* (2016).

2. Research Contributions and Practical Applications - Since January 1, 2013

Note: Unless otherwise specified, Seltzer was lead advisor on the projects associated with each publication. In these cases, Seltzer met with students weekly to guide their research, but they were responsible for conducting the work. Papers were then written collaboratively, typically with Seltzer and the lead student splitting the work approximately in half with minor contributions from other students.

Published Refereed Contributions

- 5. Pasquier, T., Han, X., Moyer, T., Bates, A., Hermant, O., Eyers, D., Bacon, J., Seltzer, M., "Runtime Analysis of Whole-System Provenance," *Proceedings of the 2018 Conference on Computer and Communications Security*, (CCS '18) Toronto CA, October 2018. (16 pages).
- 6. **Han, X**., Pasquier, T., Seltzer, M., "Provenance-based Intrustion Detection: Opportunities and Challenges," Proceedings of the Workshop on the Theory and Practice of Provenance, (Tapp 2018), London UK, July 2018. (4 pages).
- Pasquier, T., Lau, M., Han, X., Fong, E., Lerner, B., Boose, E., Crosas, M., Ellison, A., Seltzer, M., "Sharing and Preserving Computational Analyses for Posterity with encapsulator," IEEE Computing in Science and Engineering 20(111), July 2018. doi: 10.1109/MCSE.2018.042781334 [Seltzer collaborated with Pasquier and Lau on development and edited paper; contribution 15%]
- Huang, Y., Pavlovic, M., Marathe, V., Seltzer, M., Harris, T., Byan, S., "Closing the Performance Gap Between Volatile and Persistent Key-Value Stores Using Cross-Referencing Logs," Proceedings of the 2018 USENIX Annual Technical Conference, Boston MA, June 2018. (13 pages) [Seltzer co-advised Huang, helped develop the evaluation, and edited the paper; contribution 10%]
- Rao, M., Bacon, D.F., Parkes, D., and Seltzer, M., "Incentivizing Deep Fixes in Software Economies," *IEEE Transactions on Software Engineering*. (June 2018, 21 pages) doi: 10.1109/TSE.2018.2842188 [Seltzer guided development of model and edited paper; contribution 10%]
- Angelino, E., Larus-Stone, N., Alabi, D., Seltzer, M., Rudin, C., "Learning Certifiably Optimal Rule Lists for Categorical Data," *Journal of Machine Learning Research*, 18(234):1—78, 2018.
- Pasquier, T., Lau, M., Trisovic, A., Boose, E., Couturier, B., Crosas, M., Ellison, A., Gibson, V., Jones, C., Seltzer, M., "If these data could talk," to appear in *Nature Scientific*. (7/24/17, 5 pages) [Pasquier, Lau, and Trisovic led this project; Seltzer was responsible for paper editing; 10% contribution.]
- 12. Pasquier, T., Singh, J., Powles, J., Eyers, D., Seltzer, M., Bacon, J., "Data Provenance to Audit Compliance with Privacy Policy in the Internet of Things," to appear in the *Journal of Personal and Ubiquitous Computing*. (8/15/17, 13 pages) [Pasquier was responsible for approximately 50% of the work, with each of the other co-authors each contributing approximately 10%.]
- Pasquier, T., Han, X., Goldstein, M., Moyer, T., Eyers, D., Seltzer, M., Bacon, J., "Practical Whole-System Provenance Capture," *Proceedings of the ACM Symposium on Cloud Computing (SOCC 2017),* Santa Clara, CA, September 2017. (accepted 7/18/17; 14 pages) [Seltzer advised Han, Goldstein, and Pasquier; wrote/edited significant portions of the paper; contribution 20%]
- Yang, H., Rudin, C., Seltzer, M., "Scalable Bayesian Rule Lists," *Proceedings of the International Conference on Machine Learning (ICML2017)*," Sydney, Australia, August 2017. [Seltzer wrote the underlying rulelist library, conducted code reviews of all of Yang's code, contribution 33%]
- 15. Angelino, E., Larus-Stone, N., Alabi, D., Seltzer, M., Rudin, C., "Learning Certifiably Optimal Rule Lists for Categorical Data," *Proceedings of the 23rd ACM Conference on Knowledge Discovery and Data Mining* (KDD2017)." Accepted for oral presentation. Halifax, Nova Scotia, Canada, August 2017.
- Han, X., Pasquier, T., Ranjan, T., Goldstein, M., Seltzer, M., "FRAPpuccino: Faultdetection through Runtime Analysis of Provenance," *Proceedings of the Workshop on Hot Topics in Cloud Computing (HotCloud'17)*, USENIX Association, Santa Clara, CA, July 2017.

- 17. Marathe, V., Seltzer, M., Byan, S., Harris, T., "Persistent Memcached: Bringing Legacy Code to Byte-Addressable Persistent Memory." *Proceedings of USENIX Workshop on Hot Topics in Storage and File Systems (HotStorage 17),* USENIX Association, Santa Clara, CA, July 2017. [Marathe did the implementation; Seltzer advised on implementation and cowrote the paper; 20% contribution.]
- 19. Margo, D., Seltzer, M., "A Scalable Distributed Graph Partitioner," *Proceedings of the 41st International Conference on Very Large Databases (VLDB)*, Kohola Coast, HA, September 2015.
- 20. Eldridge, S., Appavoo, J., Joshi, <u>A.</u>, Waterland, A., Seltzer, M., "Towards General-Purpose Neural Network Computing," *Proceedings of the 13th International Conference on Parallel Architectures and Compilation Techniques (PACT 2015)*, Petrozavodsk Russia, September 2015. [Seltzer co-wrote and edited paper; 10% effort.]
- 21. Balakrishnan, N., Bytheway, T., Carata, L., Chick, O., Snee, J., Akoush, S., Sohan, R., Seltzer, M., Hopper, A., "Recent Advances in Computer Architecture: The Opportunities and Challenges for Provenance," *Proceedings of the 7th Workshop on the Theory and Practice of Provenance (TaPP 2015)*, Edinburgh Scotland, July 2015. [Seltzer did minor writing and editing; contribution 5%]
- 22. Macko, P., Margo, D., Marathe, V., Seltzer, M., "LLAMA: Efficient Graph Analytics Using Large Multiversioned Arrays," *Proceedings of the 31st IEEE International Conference on Data Engineering (ICDE 2015)*, Seoul Korea, April 2015.
- 23. Appavoo, J., Waterland, A., Eldridge, S., Zhao, K., Joshi, A, Homer, S, Seltzer, M, "Programmable Smart Machines: A Hybrid Neuromorphic approach to General Purpose Computation," *Proceedings of the first workshop on Neuromorphic Architectures* (*NeuroArch*) collocated with ISCA 2014. [Seltzer co-wrote and edited paper; 10% effort.]
- 24. Angelino, E., Kohler, E., Waterland, A., Seltzer, M., Adams, M., "Accelerating MCMC via parallel predictive prefetching," *Proceedings of the 2014 Conference on Uncertainty in Artificial Intelligence (UAI '14)*, Quebec City, Quebec Canada, July 2014. [Angelino was coadvised by Seltzer and Adams; Adams appears last because we published in his (ML) community.]
- 25. Rao, M., Parkes, D., Seltzer, M., Bacon, D., "A Framework for Incentivizing Deep Fixes," *Proceedings of the AAAI 2014 Workshop on Incentives and Trust in E-Communities (WIT-EC'14)*, Quebec City, Quebec Canada, July 2014. [Seltzer guided development of model and edited paper; contribution 10%]
- 26. Carata, L., Akoush, S., Balakrishnan, N., Bytheway, T., Sohan, R., Seltzer, M., Hopper, A., 2014. "A primer on provenance." *Communications of the ACM* 57, 5 (May 2014), 52-60. DOI=10.1145/2596628 <u>http://doi.acm.org/10.1145/2596628</u>. [Highly collaborative effort; 15% contribution.]
- 27. Waterland, A., Angelino, E., Adams, R., Appavoo, J., Seltzer, M., "ASC: Automatically Scalable Computation" *Proceedings of the 2014 Conference on Architectural Support for Programming Languages and Operating Systems*, Salt Lake City Utah, March 2014.
- Herzlinger, R., Seltzer, M., Gaynor, M., "Applying KISS to Healthcare Information Technology," *Computer* 46(11), IEEE, November 2013, 72--74. [Seltzer produced most of the final prose for the paper; 50% contribution.]
- Borkin, M., Yeh, C., Boyd, M., Macko, P., Gajos, K., Seltzer, M., Pfister, H., "Evaluation of Filesystem Provenance Visualization Tools," *Proceedings of the 2013 Conference on Information Visualization (Vis 2013)*, Atlanta Georgia, October 2013. [Yeh and Boyd were

co-advised by Seltzer and Borkin(postdoc)/Pfister(faculty); Pfister appears last because we published in a visualization venue, and that is his community.]

- Macko, P., Margo, D., Seltzer, M., "Local Clustering in Provenance Graphs," *Proceedings* of the 2013 International Conference on Information and Knowledge Management (CIKM 2013), Burlingame CA, October 2013.
- 31. Waterland, A., Angelino, E., Cubuk, E., Kaziras, E., Adams, R., Appavoo, J., Seltzer, M., "Computational Caches," *Proc. of the 2013 SYSTOR Conference*, Haifa Israel, July 2013.
- 32. Macko, P., Margo, D., Seltzer, M., "Performance Introspection of Graph Databases," *Proceedings of the 2013 SYSTOR Conference*, Haifa Israel, July 2013.
- 33. Holland, D., Angelino, E., Wald, G., Seltzer, M., "Flash Caching on the Storage Client," *Proceedings of the 2013 USENIX Annual Technical Conference*, San Jose, CA, June 2013.

Other Refereed Contributions: None

Non-Refereed Contributions: None

Contributions to practical applications of knowledge CamFlow

- Provenance canture software
- Provenance capture software: <u>http://www.camflow.org</u>
- FRAPpucino Intrusion Detection system: <u>https://github.com/michael-hahn/frap</u> Certifiably Optimal Rule Lists (CORELS)
 - Website: https://corels.eecs.harvard.edu/
 - Source code repository: <u>https://github.com/nlarusstone/corels</u>

Scalable Bayesian Rule List Software

- R Package on CRAN: <u>https://cran.r-project.org/web/packages/sbrl/index.html</u>
- Github Repository for C library and R package: <u>https://github.com/Hongyuy/sbrlmod</u>
- Scalable Host-tree Embeddings for Efficient Partitioning
 - Software: <u>https://github.com/dmargo/sheep</u>

Linked-node analytics using Large Multiversioned Arrays

• Software: <u>https://github.com/goatdb/llama</u>

Patent #9734607, "Graph processing using a mutable multilevel graph representation." Granted: August 15, 2017 with Peter Macko and Virendra Marathe.

3. Other evidence of Impact and Contributions

- A. USENIX Association: Board President (2012-2014); Vice-President (2008-2012); Acting Executive Director USENIX (2011-2012); Director at Large (1996-1998, 2006-2008)
- B. National level boards
 - DARPA Information Science and Technology Study Group (ISAT) (2017-2020)
 - National Academy of Sciences Computer Science and Telecommunications Board (2016present)
 - CRA Board of Directors (2014-2017); CRA Computing Community Consortium 2010-2013; Executive committee 2012-2013
- C. Conference Steering Committees: Operating System Design and Implementation (OSDI) 2000-present; File and Storage Technologies (FAST) 2002-present; Hot Topics in Operating Systems (HotOS) 2007-present; Workshop on the Theory and Practice of Provenance (TaPP) 2009-2016

D. Architect, Oracle Corporation (1 day per week consulting, 2006-present)

4. Delays in Research Activity: None



Conseil de recherches en sciences naturelles et en génie du Canada

APPENDIX A Personal Data (Form 100)



Complete this appendix (i) if you are an applicant or co-applicant applying for the first time; (ii) if you need to update information submitted with a previous application; or (iii) if you do not hold an appointment at a Canadian postsecondary institution. For updates, include only the revised information in addition to the date, your name and your PIN.

This information			rily to contact applicants an imittee members, and to ge			e	Date 2018/00/17
seen or used in	the adjudication pro	cess.					2018/09/17
Family name			Given name	Ini	tial(s) of all given na	mes F	Personal identification no. (PIN)
Seltzer			Margo		MI		542742
			 primary place of employme illing address is temporary 	ent is not a	a Canadian		If address is temporary, indicate:
							Starting date
							Leaving date
Telephone nu	mber		Facsimile number	E-mail	address		
(604)	8226642			mselt	tzer@cs.ubc.ca		
-	mber (alternate) 3084872		Give an alternate tele be reached at that nu	ephone nu umber duri	mber only if you can ng business hours.		Gender (completion optional) Male X Female
LANGUAGE	CAPABILITY		x				
English	Read	X	Write	X		Spe	ak X
French	Read		Write			Spe	ak
I wish to ree	ceive my corresponde	ence:	in English	X	ir	n Fren	ch
	EXPERTISE						
			cribe your area(s) of expert particular instruments and te			esear	ch subject code(s)
1 0	•	•	ms, transaction proc	essing,	data F	Prima	ry
provenanc	ce, intrusion det	ection, f	The systems				2720
					5	Secon	dary
							2711

Form 100, Appendix A (2009 W)

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Appendix D (Form 100) Consent to Provide Limited Personal Information About Highly Qualified Personnel (HQP) to NSERC

NSERC applicants are required to describe their contributions to the training or supervision of highly qualified personnel (HQP) by providing certain details about the individuals they have trained or supervised during the six years prior to their current application. HQP information must be entered on the Personal Data Form (Form 100). This information includes the trainee's name, type of HQP training (e.g., undergraduate, master's, technical etc.) and status (completed, in-progress, incomplete), years supervised or co-supervised, title of the project or thesis, and the individual's present position.

Based on the federal *Privacy Act* rules governing the collection of personal information, applicants are asked to obtain consent from the individuals they have supervised before providing personal data about them to NSERC. In seeking this consent, the NSERC applicant must inform these individuals what data will be supplied, and assure them that it will only be used by NSERC for the purpose of assessing the applicant's contribution to HQP training. To reduce seeking consent for multiple applications, applicants will only need to seek consent one time for a six-year period. If the trainee provides consent by e-mail, the response must include confirmation that they have read and agree to the text of the consent form.

When consent cannot be obtained, applicants are asked to not provide names, or other combinations of data, that would identify those supervised. However, they may still provide the type of HQP training and status, years supervised or co-supervised, a general description of the project or thesis, and a general indication of the individual's present position if known.

An example of entering HQP information on Form 100 (with and without consent):

Name	Type of HQP Training and Status	Years Supervised or Co-supervised	Title of Project or Thesis	Present Position			
Consent Receiv	ved from Marie Roy	ý					
Roy, Marie	Undergraduate (Completed)	Supervised 1994 - 1997	Isotope geochemistry in petroleum engineering	V-P (Research), Earth Analytics Inc., Calgary, Alberta			
Consent Not O	Consent Not Obtained from Marie Roy						
(name withheld)	Undergraduate (Completed)	Supervised 1994 - 1997	Isotope geochemistry	research executive in petroleum industry - western Canada			

Consent Form

Name of Trainee	
Applicant Information	
Name Seltzer, Margo MI	
Department	Postsecondary Institution
Computer Science	British Columbia
Computer Science	Difusit Columbia
status, years supervised or co-supervised, title of the pro position title and company or organization at the time the	ted data will only include my name, type of HQP training and opject or thesis and, to the best of the applicant's knowledge, my e application is submitted. I understand that NSERC will protect will only be used in processes that assess the applicant's (HQP), including confidential peer review.
Trainee's signature	Date
Note: This form must be retained by the applicant and ma	ade available to NSERC upon request.
Form 100, Appendix D (2009 W) PROTEC	TED WHEN COMPLETED Version française disponible
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