# Stephen Chou

### Summary

- Ten years of experience with designing domain-specific languages and building optimizing compilers that help programmers more easily write high-performance software.
  - Worked on a variety of production-grade compilers, including the XLA TPU compiler and IBM XL C/C++/Fortran.
  - Was a primary contributor to the TACO tensor algebra compiler, which generates fast code for performing sparse tensor algebra computations given high-level specifications of the desired computation and input/output data structures.
  - o Multiple publications, including a distinguished paper award, at top programming language and compiler conferences such as OOPSLA, PLDI, and CGO.
  - Working experience with the LLVM and MLIR compiler frameworks.
- Proficient in C++ and C and have working experience with Python, JavaScript, MATLAB, Java, SQL, and Bash.

#### Education

01/2018-08/2022 PhD, Computer Science, Massachusetts Institute of Technology.

Dissertation: Format Abstractions for the Compilation of Sparse Tensor Algebra.

Advisor: Prof. Saman Amarasinghe.

09/2015-01/2018 SM, Computer Science, Massachusetts Institute of Technology.

Thesis: Unified Sparse Formats for Tensor Algebra Compilers.

Advisor: Prof. Saman Amarasinghe.

09/2010-04/2015 BASc, Computer Engineering, University of Waterloo.

Cumulative GPA: 94%. (Graduated on Dean's Honours List with distinction.)

# Industry and Research Experience

05/2024-Present Senior Software Engineer, Google, Sunnyvale, CA.

10/2022-04/2024 Software Engineer, Google, Sunnyvale, CA.

- o Contribute to the XLA TPU compiler with a focus on building out and maintaining the MLIR-based middle end and LLVM back end for SparseCores, which are specialized processors in TPUs that are designed for accelerating embedding-based ML workloads.
- Lead bring-ups of the SparseCore compiler stack for new generations of TPUs, with responsibility for ensuring the compiler supports and utilizes new hardware features.

09/2015-08/2022 Research Assistant, Massachusetts Institute of Technology, Cambridge, MA.

- Generalized the TACO tensor algebra compiler theory to support efficiently computing with sparse tensors that may be stored in a wide variety of data structures. This helps speed up real-world sparse tensor algebra computations by letting users store their data in specialized data structures that are optimized for the data.
- Developed a more user-friendly compiler front end for Simit, a programming language for computing on sparse systems using linear algebra. This new front end was later also adapted for use in the compiler for GraphIt, a graph programming language.
- Developed a web interface for TACO (http://tensor-compiler.org/codegen).

06/2018–08/2018 Research Intern, Microsoft, Redmond, WA.

• Designed and implemented a prototype framework that can improve the performance of deep learning models in TensorFlow by automatically applying user-defined, highlevel architectural optimizations. Worked with Drs. Minjia Zhang and Yuxiong He.

- 01/2015-08/2015 Research Assistant, University of Waterloo, Waterloo, ON, Canada.
  - Prototyped mathematical (SMT) models that can be used to automatically synthesize designs for capillary electrophoresis devices given user-specified requirements and constraints. Worked with Prof. Derek Rayside.
- 09/2014-12/2014 Compiler Optimization Developer Co-op, IBM, Markham, ON, Canada.
- 01/2014–04/2014 Extended the IBM XL C/C++/Fortran compiler's high-level optimizer to vectorize type conversions (yielding up to  $\sim 30\%$  performance gain on some SPEC benchmarks) and prototyped alternative cost models for the auto-SIMDizer.
  - Investigated and fixed defects in the XL compiler's optimizer.
- 05/2013-08/2013 Software Engineering Intern, OptumSoft, Menlo Park, CA.
  - Designed and implemented a GraphLab-inspired distributed graph processing framework prototype, using the TACC programming language developed by OptumSoft.
- 08/2012–12/2012 Software Developer Co-op, Sybase, Waterloo, ON, Canada.
- 01/2012-04/2012 Developed tools and investigated techniques for improving the performance and opti-05/2011-08/2011 mality of Sybase SQL Anywhere's join optimizer. Worked with Dr. Anisoara Nica.
  - Developed a replacement system for aggregating Sybase product crash reports and usage statistics. System was implemented entirely in Sybase SQL.

#### **Publications**

#### **Conference Publications**

- OOPSLA 2022 <u>Stephen Chou</u> and Saman Amarasinghe. Compilation of Dynamic Sparse Tensor Algebra. In *Proceedings of the ACM on Programming Languages, Volume 6, Issue OOPSLA2*, 2022.
  - CGO 2022 Daniel Donenfeld, Stephen Chou, Saman Amarasinghe. Unified Compilation for Lossless Compression and Sparse Computing. In Proceedings of the 2022 IEEE/ACM International Symposium on Code Generation and Optimization, 2022.
- OOPSLA 2021 Rawn Henry, Olivia Hsu, Rohan Yadav, Stephen Chou, Kunle Olukotun, Saman Amarasinghe, Fredrik Kjolstad. Compilation of Sparse Array Programming Models. In Proceedings of the ACM on Programming Languages, Volume 5, Issue OOPSLA, 2021.
- OOPSLA 2020 Ryan Senanayake, Changwon Hong, Ziheng Wang, Amalee Wilson, Stephen Chou, Shoaib Kamil, Saman Amarasinghe, Fredrik Kjolstad. A Sparse Iteration Space Transformation Framework for Sparse Tensor Algebra. In *Proceedings of the ACM on Programming Languages, Volume 4, Issue OOPSLA*, 2020.
  - PLDI 2020 <u>Stephen Chou</u>, Fredrik Kjolstad, Saman Amarasinghe. Automatic Generation of Efficient Sparse Tensor Format Conversion Routines. In *Proceedings of the 41st ACM SIGPLAN International Conference on Programming Language Design and Implementation*, 2020.
- OOPSLA 2018 Stephen Chou, Fredrik Kjolstad, Saman Amarasinghe. Format Abstraction for Sparse Tensor Algebra Compilers. In *Proceedings of the ACM on Programming Languages*, Volume 2, Issue OOPSLA, 2018.
- OOPSLA 2017 Fredrik Kjolstad, Shoaib Kamil, <u>Stephen Chou</u>, David Lugato, Saman Amarasinghe. The Tensor Algebra Compiler. In <u>Proceedings of the ACM on Programming Languages</u>, Volume 1, Issue OOPSLA, 2017. [Distinguished Paper Award]

#### Peer-Reviewed Short/Workshop Publications

SPAA 2020 Suzanne Mueller, Peter Ahrens, Stephen Chou, Fredrik Kjolstad, Saman Amarasinghe. Sparse Tensor Transpositions. In *Proceedings of the 32nd ACM Symposium on Parallelism in Algorithms and Architectures (brief announcement)*, 2020.

- Chocs Avancées David Lugato, Fredrik Kjolstad, <u>Stephen Chou</u>, Saman Amarasinghe, Shoaib Kamil. Taco: compilation et génération de code d'expressions tensorielles. In *Chocs Avancées*, No. 12, 2018.
  - ASE 2017 Fredrik Kjolstad, Stephen Chou, David Lugato, Shoaib Kamil, Saman Amarasinghe. taco: A Tool to Generate Tensor Algebra Kernels. In Proceedings of the 32nd IEEE/ACM International Conference on Automated Software Engineering (tools paper and demo), 2017.
  - DBTest 2013 Anisoara Nica and Stephen Chou. Using Similarity Distance for Performance Prediction of the Query Optimization Process. In *Proceedings of the Sixth International Workshop on Testing Database Systems*, 2013.

#### Patents

01/2013 Resource Estimation For A Query Optimization Process.

Anisoara Nica and Stephen Chou. Patent number: US 9,298,771 B2.

# Teaching Experience

- 10/2021 Workshop Instructor, Boston College, Chestnut Hill, MA.
  - Prepared and delivered a two-hour Introduction to Unix Shell workshop, designed for undergraduate computer science and engineering students, that covered the basics of Bash and Vim.
- 09/2020-12/2020 Teaching Assistant, Massachusetts Institute of Technology, Cambridge, MA.
  - Handled logistics associated with running the Dynamic Computer Language Engineering course (6.818), which had 30+ students. This included keeping course website up to date, answering student questions on Piazza, and preparing and grading miniquizzes that were given after every lecture.
  - Prepared and graded semester-long course project, which required students to implement an optimized virtual machine for a dynamic programming language.
  - Prepared and delivered nine recitations over the semester that were designed to aid students with their project. Also held weekly office hours to assist students one-on-one.

#### Awards & Honors

- 10/2017 Distinguished Paper Award, OOPSLA 2017.
- 06/2015 Albert Sherwood Barber Medal for Best Overall Work Term and Academic Performance, University of Waterloo.
- 02/2015 First in Class Engineering Scholarship for 4A term, University of Waterloo.
- 06/2014 First in Class Engineering Scholarship for 3B term, University of Waterloo.
- 10/2013 First in Class Engineering Scholarship for 3A term, University of Waterloo.
- 07/2012 iAnywhere Solutions Inc. Scholarship, University of Waterloo.

#### Invited Talks

#### Format Abstractions for Compilation of Sparse Tensor Algebra

- 07/2021 Google Compiler ML Reading Group
- 07/2020 MIT Fast Code Seminar
- 02/2019 ADA Liaison Meeting Talk
- 01/2019 Invited Workshop on Compiler Techniques for Sparse Tensor Algebra, MIT

## Professional Service

Journal Review IEEE TC: Transactions on Computers (2019)

Conference MLSys: Conference on Machine Learning and Systems (2022)

Review Func Part European Conference on Parallel and Distributed (

**Euro-Par:** European Conference on Parallel and Distributed Computing (2020)

SPAA: Symposium on Parallelism in Algorithms and Architectures (2019, 2021)

**PLDI:** Programming Language Design and Implementation (2019)

CGO: Symposium on Code Generation and Optimization (2017, 2018, 2022)

Committees CGO 2020 Artifact Evaluation Committee