Chris Olah

"I want to understand things clearly and explain them well."

Work Experience

Oct. 2018 - **OpenAI**, Member of Technical Staff.

• Led new Clarity team working on neural network intepretability.

Oct. 2016 - 2018 Google Brain, Research Scientist.

Oct. 2015 - 2016 Google Brain, Research Associate.

Continued basic research in neural networks.

May - Oct., 2015 Google Brain, Intern.

Host: Greg Corrado O Visualized the 'platonic ideal' of classes according to convolutional neural networks.

Developed other novel techniques for visualizing neural networks.

July - Oct, 2014 Google Brain, Intern.

Host: Jeff Dean O Explored the use of interactive media for visualizing neural networks representations.

• Created the meta-SNE algorithm, which can visualize the space of neural networks.

July - Sep, 2011 **Xelerance**, Intern.

July - Nov, 2010 **Environment Canada**, Research Assistant.

July - Aug, 2009 University of Toronto, Dept. of Forestry, Research Assistant.

Honours

July 2012 **Thiel Fellowship**.

\$100,000 Fellowship that supports exceptional people under the age of 20 pursue research or start companies.

July 2010 AP National Scholar.

Graduated high school with six AP (university equivalent) credits.

Published Security Vulnerabilities

May 2011 Unbound DNS Resolver DDOS Vulnerability.

CVE-2011-1922 / VU#531342

Review Service

2014 International Conference on Machine Learning.

2014, 2016 International Conference on Learning Representations.

2014 Neural Information Processing Systems Deep Learning Workshop.

Writing

- March, 2019 Activation Atlases, Shan Carter, Zan Armstrong, Ludwig Schubert, Ian Johnson, & Chris Olah. Distill.
 - Differentiable Image Parameterizations, Alexander Mordvintsev, Nicola Pez-July, 2018 zotti, Ludwig Schubert, & Chris Olah. Distill.
- The Building Blocks of Interpretability, Chris Olah, Alexander Mordvintsev, March, 2018 100+ citations & Ludwig Schubert. Distill.
 - Is Generator Conditioning Causally Related to GAN Performance?, Augus-Feb 2018 tus Odena, Jacob Buckman, Catherine Olsson, Tom B Brown, Christopher Olah, Colin Raffel, & Ian Goodfellow. Arxiv preprint.
 - Nov, 2017 Feature Visualization, Chris Olah, Alexander Mordvintsev, & Ludwig Schubert. 100+ citations Distill.
- Research debt, Christopher Olah & Shan Carter. Distill. March, 2017 3 citations
 - Feb, 2017 Changing model behavior at test-time using reinforcement learning, Au-11 citations gustus Odena, Dieterich Lawson, & Christopher Olah. Arxiv preprint.
 - Dec, 2016 Four Experiments in Handwriting with a Neural Network, Shan Carter, 400,000+ views David Ha, Ian Johnson, & Chris Olah. Distill. 7 citations
 - Oct, 2016 Conditional Image Synthesis With Auxiliary Classifier GANs, Augustus 500+ citation Odena, Chris Olah, & Jon Shlens. ArXiv preprint.
 - Deconvolution and Checkerboard Artifacts, Augustus Odena, Vincent Du-Oct. 2016 100.000+ views moulin, & Chris Olah. Distill. 300+ citation
- Sept 8, 2016 Attention and Augmented Recurrent Neural Networks, Chris Olah & Shan 100,000+ views Carter. Distill. 36 citations
 - Concrete Problems in Al Safety, Dario Amodei, Chris Olah, Jacob Steinhardt, 2016 300+ citation Paul Christiano, John Schulman, & Dan Mané.
 - TensorFlow: Large-scale machine learning on heterogeneous systems, Martin Abadi, Ashish Agarwal, Paul Barham, Eugene Brevdo, Zhifeng Chen, Craig Citro, Greg S Corrado, Andy Davis, Jeffrey Dean, Matthieu Devin, Sanjay Ghemawat, Ian Goodfellow, Andrew Harp, Geoffrey Irving, Michael Isard, Yangqing Jia, Rafal Jozefowicz, Lukasz Kaiser, Manjunath Kudlur, Josh Levenberg, Dan Mané, Rajat Monga, Sherry Moore, Derek Murray, Chris Olah, Mike Schuster, Jonathon Shlens, Benoit Steiner, Ilya Sutskever, Kunal Talwar, Paul Tucker, Vincent Vanhoucke, Vijay Vasudevan, Fernanda Viégas, Oriol Vinyals, Pete Warden, Martin Wattenberg, Martin Wicke, Yuan Yu, Xiaoqiang Zheng. Software available from tensorflow.org.
- **Visual Information Theory**, colah.github.io.
- Sep. 3, 2015 Neural Networks, Types, and Functional Programming, colah.github.io. 100,000+ views
- Aug. 31, 2015 $_{400,000+\ views}$ Calculus on Computational Graphs: Backpropagation, colah.github.io.
 - Understanding LSTM Networks, colah.github.io.

2015 10,000+ citations

8 citations

 $\underset{3,000,000+\ views}{\text{Aug.}}\ 27,\ 2015$ 500+ citations

- June 17, 2015

 1,700,000+ views
 300+ citations

 Inceptionism: Going Deeper into Neural Networks, Google Research Blog.

 Alexander Mordvintsev, Christopher Olah, & Mike Tyka.
- Jan. 16, 2015 Visualizing Representations: Deep Learning and Human Beings, colah.github.io.
 - Dec. 2014 **Document Embedding with Paragraph Vectors**, NIPS Deep Learning Workshop. Andrew M Dai, Christopher Olah, Quoc V Le, & Greg S Corrado.
- Dec. 8, 2014 **Groups & Group Convolutions**, colah.github.io.
- Oct. 9, 2014 **Visualizing MNIST: An Exploration of Dimensionality Reduction**, colah.github.io.
- July 13, 2014 **Understanding Convolutions**, colah.github.io.
- July 8, 2014 $_{200,000+\,\mathrm{views}}^{}$ 11 citations Conv Nets: A Modular Perspective, colah.github.io.
- July 7, 2014 $\underbrace{\text{Deep Learning, NLP, and Representations}}_{200,000+\,\text{views}}$
- July 6, 2014 Fanfiction, Graphs, and PageRank, colah.github.io.
- April 6, 2014 $_{500,000+\ views}^{500,000+\ views}$ 15 citations Neural Networks, Manifolds, and Topology, colah.github.io.
- In Progress A Weird, Motivated, Intuitive, Introduction to Topology., github.com/colah/.
- July 16, 2013 $\underbrace{\text{Order Statistics}}_{500+ \text{ views}}$ Order Statistics, colah.ca.
- June 9, 2013 How My Neural Net Sees Blackboards (Part 2), colah.ca.
- May 29, 2013 I'm Sick and Tired of 3D Printed Guns, colah.ca.
- May 11, 2013 How My Neural Net Sees Blackboards, colah.ca.
- June 17, 2012 Monads for the Terrified, colah.ca.
- Feb 10, 2012 Quantified Hacklab (Part 1), colah.ca.
- Nov 6, 2011 Manipulation of Implicit Functions (With an Eye on CAD), colah.ca.
- Nov 1, 2011 **Producing Lenses with 3D Printers**, Open Hardware Journal.
- Aug. 11, 2011 You Already Know Calculus: Differential (One) Forms, colah.ca.
- Aug. 8, 2011 The Real 3D Mandelbrot Set, colah.ca. $^{15,000+\ views}$
- July 31, 2011 You Already Know Calculus: Derivatives, colah.ca. $_{500+\ views}$
- July 16, 2011 Surface-Oriented CAD, Math, & Telescopes, colah.ca.
- June 6, 2011 Alien Mathematics, Numbers, and Polynomial Centric Societies, colah.ca.
- April 18, 2011 Rethinking Topology (or a Personal Topologodicy), colah.ca.

- March 28, 2011 Rethinking Grade School Algebra, colah.ca.
 - July 8, 2010 Towards a Better Notation for Mathematics, colah.ca.

Talks

- June 23, 2016 **Deep Learning Transparency**, ICML 2016 Workshop on Visualization for Deep Learning. Invited Speaker.
- June 1, 2016 **How Neural Networks Bend Data**, Music, Art, & Machine Intelligence Workshop, Google. Invited Speaker.
- March 18, 2016 **Media and Neural Networks**, Tools for Thought Workshop, Recurse Center. Invited Speaker.
 - Feb 26, 2016 **How Neural Networks Bend Data**, DeepDream: The art of neural networks, Gray Area Foundation for the Arts. Invited Speaker.
 - Feb 10, 2015 Neural Networks and the Structure of Data, Intersections KW.
 - Nov 17, 2014 Why Pattern Recognition is Hard, and Why Deep Neural Networks Help, Waterloo Computer Science Club.
 - Jan. 24, 2014 Visualizing the Space of Neural Network Hyper-Parameters, Google.
 - Sep 30, 2013 **Smart Kids Are Doing it for Themselves**, Equinox Summit: Learning 2030, Perimeter Institute. Invited Panelist.
 - July 12, 2013 **3D Printing For Mathematical Visualization**, Canadian Undergraduate Math Conference.
- Nov. 17, 2012 Constructive Ways to Build a Better Future, TEDxYouth@Toronto.
- Oct. 13, 2012 **Multiplicative Calculus For Analyzing Exponential Trends**, Singularity Summit.
- April 18, 2012 **3D Printing & ImplicitCAD**, Noisebridge.
- Nov. 8, 2011 Open Source 3D Printing: The Printers, Toolchain, & Things, Greater Toronto Area Linux User Group.
- Oct. 1, 2011 **3D Printing Awesome Things**, SoOnCon.
- Sep. 17, 2011 Programmatic CAD and its Future, NYC Maker Faire.

Selected Open Source Participation

- 2018 Lucid, Founder.
 - github.com/tensorflow/lucid Tools for visualizing neural networks.
- 2011 2013 ImplicitCAD, Founder.
 - implicit.herokuapp.com A programming language that compiles into 3D objects, written in Haskell
 - o Implemented geometry engine (primitives, CSG, etc), interpreter, & GCode generation
- Jan Feb, 2013 **Printrun**, Contributor.
 - github.com/kliment/Printrun Pure Python 3d printing host software
 - Added safety checks and improved CLI interface

May - March, Printable Vacuum Cleaner, Author.

 $2011 \quad github.com/colah/Printable-Vacuum-Cleaner$

A Hand Held 3D printable vacuum cleaner!

May - Sep., 2011 **surfcad**, Author.

github.com/colah/surfcad/ - Surface-Oriented Programmatic CAD

May - Jan., 2011 Idnsx, Author.

github.com/colah/ldnsx/ - A better Python Idns interface

March - Sep., OpenSCAD, Contributor.

2011 www.openscad.org - Programmatic 3D CAD

• Implemented syntax highlighting and language extensions

2010 - 2011 Malthus RepRap, Core Developer.

github.com/hacklabto/Hacklab-RepRap

An open-source 3D printer striving for self-replication, derived from the Prusa Mendel

Redesigned parts to reduce print time and increase ease of assembly

2009 - 2010 Sage, Contributor.

www.sagemath.org - Open-Source Mathematics Software

Added support for exporting 3D visualizations as STLs for 3D printing

Leadership

2016 - **Distill Journal**, Editor & Founder.

A scientific journal dedicated to clear communication.

2009 - 2014 hacklab.to, Member & Director.

A hackerspace (community technology space) in Toronto

- Oversaw management of corporation as a Director (Feb 2012 Feb 2014).
- Helped maintain the safety and functionality of the physical space.
- 2012 2013 **DIY Bio Toronto**, Co-Organizer.

Biology enthusiasts looking to start a biohackerspace

- Organized several meetups.
- Started the Molecular Biology of the Cell (Alberts, et al.) study group.
- 2012 2013 Toronto Haskell Meetup, Organizer.

Haskell enthusiasts

o Organized monthly meetups.

2011 - 2012 Toronto 3D Printers, Organizer.

3D Printing Enthusiasts

• Organized the group while it grew from a handful of people to 40+.

Volunteering

2015- Open Philanthropy Project, Scientific Adviser.

Providing scientific expertise on machine learning & artificial intelligence.

2010 - 2012 **Free Byron**, Court Supporter.

Documenting the trial of security researcher Byron Sonne

Feb. - Sep., 2010 Fort York Food Bank, Volunteer.

Distributed food to clients

Teaching

I've taught five seminar series on neural networks (one online, one at GiveWell, and three at Google). I've also taught many different workshops at hacklab.to on topics ranging from Integral Transforms to \LaTeX