# Colin Raffel

## Education

#### Google, Mountain View, CA

Resident in the Google Brain group, 2016–present

#### Columbia University, New York, NY

PhD in Electrical Engineering at the Laboratory for the Recognition and Organization of Speech and Audio, advisor Dan Ellis, 4.1 cumulative GPA, 2012–2016

#### Stanford University, Stanford, CA

Master of Arts in Music, Science, and Technology at the Center for Computer Research in Music and Acoustics, 4.1 cumulative GPA, 2009–2010

## Oberlin College, Oberlin, OH

Bachelor of Arts in Mathematics with Physics minor and independent studies in audio circuit design, 3.7 cumulative GPA, 2005-2009

# Publications

Colin Raffel, Thang Luong, Peter J. Liu, Ron J. Weiss, and Douglas Eck, "Online and Linear-Time Attention by Enforcing Monotonic Alignments", *arXiv preprint arXiv:1704.00784*, 2017.

Colin Raffel and Dieterich Lawson, "Training a Subsampling Mechanism in Expectation", Workshop Extended Abstracts of the 5th International Conference on Learning Representations, 2017 (to appear).

Justin Gilmer, Colin Raffel, Samuel S. Schoenholz, Maithra Raghu, and Jascha Sohl-Dickstein, "Explaining the Learning Dynamics of Direct Feedback Alignment", Workshop Extended Abstracts of the 5th International Conference on Learning Representations, 2017 (to appear).

Colin Raffel and Daniel P. W. Ellis, "Extracting Ground Truth Information from MIDI Files: A MIDIfesto", Proceedings of the 17th International Society for Music Information Retrieval Conference, 2016.

Colin Raffel, "Learning-Based Methods for Comparing Sequences, with Applications to Audio-to-MIDI Alignment and Matching", *PhD Thesis*, 2016.

Colin Raffel and Daniel P. W. Ellis, "Feed-Forward Networks with Attention Can Solve Some Long-Term Memory Problems", Workshop Extended Abstracts of the 4th International Conference on Learning Representations, 2016.

Colin Raffel and Daniel P. W. Ellis, "**Pruning Subsequence Search with Attention-Based Embedding**", *Proceedings of the 41st IEEE International Conference on Acoustics, Speech and Signal Processing*, 2016.

Colin Raffel and Daniel P. W. Ellis, "Optimizing DTW-Based Audio-to-MIDI Alignment and Matching", Proceedings of the 41st IEEE International Conference on Acoustics, Speech and Signal Processing, 2016.

Nikolai Yakovenko, Liangliang Cao, Colin Raffel, and James Fan, "**Poker-CNN: A Pattern** Learning Strategy for Making Draws and Bets in Poker Games", *Proceedings of the 30th AAAI Conference on Artificial Intelligence*, 2016. Colin Raffel and Daniel P. W. Ellis, "Accelerating Multimodal Sequence Retrieval with Convolutional Networks", NIPS Multimodal Machine Learning Workshop, 2015.

Colin Raffel and Daniel P. W. Ellis, "Large-Scale Content-Based Matching of MIDI and Audio Files", Proceedings of the 16th International Society for Music Information Retrieval Conference, 2015.

Brian McFee, Colin Raffel, Dawen Liang, Daniel P. W. Ellis, Matt McVicar, and Oriol Nieto, "librosa: Audio and Music Signal Analysis in Python", *Proceedings of the 14th Python in Science Conference*, 2015.

Colin Raffel, Brian McFee, Eric J. Humphrey, Justin Salamon, Oriol Nieto, Dawen Liang, and Daniel P. W. Ellis, "mir\_eval: A Transparent Implementation of Common MIR Metrics", *Proceedings of the 15th International Society for Music Information Retrieval Conference*, 2014.

Colin Raffel and Daniel P. W. Ellis, "Estimating Timing and Channel Distortion Across Related Signals", Proceedings of the 39th IEEE International Conference on Acoustics, Speech and Signal Processing, 2014.

Colin Raffel, "Using Noise Substitution for Backwards-Compatible Audio Codec Improvement", Proceedings of the 129th Convention of the Audio Engineering Society, 2010.

Colin Raffel and Julius O. Smith, "Practical Modeling of Bucket-Brigade Device Circuits", Proceedings of the 13th International Conference on Digital Audio Effects (DAFx-10), 2010.

Colin Raffel, Nick Kruge, Diane Douglas, Edgar Berdahl, and Wendy Ju, "The Lattice Harp: A New Hybrid Instrument and Controller", *Proceedings of the 2010 International Computer Music Conference*, 2010.

## Technical Reports, Whitepapers, etc.

Andreas Jansson, Colin Raffel, and Tillman Weyde, "This Is My Jam: Data Dump", 16th International Society for Music Information Retrieval Conference Late Breaking and Demo Papers, 2015.

Colin Raffel, "Learning Efficient Representations for Sequence Retrieval", National Science Foundation Data Science Workshop, 2015.

Colin Raffel and Daniel P. W. Ellis, "Intuitive Analysis, Creation and Manipulation of MIDI Data with pretty midi", 15th International Society for Music Information Retrieval Conference Late Breaking and Demo Papers, 2014.

Colin Raffel and Daniel P. W. Ellis, "Reproducing Pitch Experiments in "Measuring the Evolution of Contemporary Western Popular Music"", *Technical Report*, 2013.

## Honors and Awards

National Science Foundation Student Travel Grant, 41st IEEE International Conference on Acoustics, Speech, and Signal Processing, 2016

Best Student Paper, 16th International Society for Music Information Retrieval Conference, 2015

Travel Grant, National Science Foundation Data Science Workshop, 2015

**Best Poster Presentation**, 15th International Society for Music Information Retrival Conference, 2014

Student Travel Award, International Society for Music Information Retrieval, 2014

Prize for Reproducibility in Audio and Music Research, SoundSoftware.ac.uk, 2013

National Science Foundation Integrative Graduate Education and Research Traineeship Grant, 2012–2014

Ableton Best Hack Award, Music Hack Day San Francisco, 2012

Best Educational App: Rock Prodigy, Appy Awards, 2011

Echo Nest Best Hack Award, Music Hack Day Barcelona, 2010

7Digital Best Hack Award, Music Hack Day Barcelona, 2010

# **Business Ventures**

## **Experimentalists Anonymous**

Design, build, and sell custom electronic devices; host audio circuit schematic archive with over three million downloads served; maintain online message board with over fourteen thousand posts; provide site hosting for do-it-yourself audio hardware enthusiasts; help individuals start successful independent businesses selling electronic audio devices, 2003–present

## Noisette Audio, LLC

Provided consulting services in the field of audio signal processing, analysis, and synthesis; develop software for electronic music composition, 2011-2012

# Teaching

## Teacher's Assistant, Deep Learning for Computer Vision and NLP

Advised students on software and final projects culminating in multiple conference submissions, 2015

## Teacher's Assistant, Music Digital Signal Processing

Evaluated projects, provided assistance, and held office hours for a Master's-level course, 2013-2014

#### Electronics

Filled in for a professor on sabbatical and taught a recurring electronics course in the Oberlin College Physics Department, 2009

## **Circuit Bending**

Taught a course on modifying electronic music circuits and basic electronics as part of the Oberlin Experimental College program; developed a curriculum, lab activities, and lectures, 2006

## Students Supervised

Rafael Valle, visiting researcher at Columbia University, 2015

Hilary Mogul, undergraduate student at Columbia University, 2014

 $\mathbf{Dylan}$  Kario, undergraduate student at Columbia University, 2014

Zhengshan Shi, visiting researcher at Columbia University, 2013

## Talks

The Lakh MIDI Dataset: How It Was Made, and How to Use It at *BISH Bash Meetup*, 2016.

**Extracting Ground Truth Information from MIDI Files: A MIDIfesto** at 17th International Society for Music Information Retrieval Conference, 2016.

Learning-Based Methods for Comparing Sequences, with Applications to Audio-to-MIDI Alignment and Matching at 2nd ICML Machine Learning for Music Discovery Workshop, 2016.

**Optimizing DTW-Based Audio-to-MIDI Alignment and Matching** at *41st IEEE* International Conference on Acoustics, Speech, and Signal Processing, 2016.

Accelerating Large-Scale Sequence Retrieval with Convolutional Networks at *IIT Bombay Electrical Engineering Seminar*, 2015.

Large-Scale Content-Based Matching of MIDI and Audio Files at 16th International Society for Music Information Retrieval Conference, 2015.

Learning Efficient Representations for Sequence Retrieval at Boston Data Festival, 2015.

Using Convolutional Networks (with Attention) for Orders-of-Magnitude Speedup of DTW-Based Sequence Retrieval at Spotify Machine Learning Seminar, 2015.

Recurrent Networks in Lasagne at Mount Sinai Hammer Lab Seminar, 2015.

Lasagne Tutorial at Next.ml Boston, 2015.

Theano Tutorial at Next.ml Boston, 2015.

**mir\_eval** at Objective Evaluation in Semantic Audio Analysis and Processing Panel at the 138th Convention of the Audio Engineering Society, 2015.

MIR at LabROSA in 2014 at NEMISIG 2015, 2015.

Large-Scale Content-Based Matching of Audio and MIDI Data at Stanford University DSP Seminar, 2015.

Advances and Challenges in Large-Scale Music Information Retrieval at Digital Music Research Network+8, 2013.

Quantifying Rhythmic Synchrony at Midwestern Music Cognition Symposium, 2013.

A Sequential Approach to Musical Event Detection at Carnegie Mellon University Music and Technology Seminar, 2011.

Using Noise Substitution for Backwards-Compatible Audio Codec Improvement at 129th Convention of the Audio Engineering Society, 2010.

**ROW-mp3: An Enhanced MP3-Compatible Audio Codec** at *Stanford University DSP* Seminar, 2010.

**Practical Modeling of Bucket-Brigade Device Circuits** at 13th International Conference on Digital Audio Effects, 2010.

The Lattice Harp: A New Hybrid Instrument and Controller at 2010 International Computer Music Conference, 2010.

An Effective Model of Bucket-Brigade Device-Based Audio Circuits at Stanford University DSP Seminar, 2010.

**Voltage-Controlled Resistance: Modulate Anything** at *Circuitastrophe Circuit Bending Music Festival*, 2008.

## **Poster Presentations**

Feed-Forward Networks with Attention Can Solve Some Long-Term Memory Problems at 4th International Conference on Learning Representations, 2016.

**Pruning Subsequence Search with Attention-Based Embedding** at 41st IEEE International Conference on Acoustics, Speech, and Signal Processing, 2016.

Accelerating Multimodal Sequence Retrieval with Convolutional Networks at NIPS Multimodal Machine Learning Workshop, 2015.

Learning Efficient Representations for Sequence Retrieval at National Science Foundation Data Science Workshop, 2015.

Intuitive Analysis, Creation and Manipulation of MIDI Data with pretty\_midi at 15th International Society for Music Information Retrieval Conference Late Breaking and Demo Papers, 2014.

mir\_eval: A Transparent Implementation of Common MIR Metrics at 15th International Society for Music Information Retrieval Conference, 2014.

**Estimating Timing and Channel Distortion Across Related Signals** at 39th IEEE International Conference on Acoustics, Speech and Signal Processing, 2014.

## Employment

## The Way of H

Developed pitch detection and audio timescale modification algorithms for Rock Prodigy, an educational iPhone application for guitarists, 2011-2013

#### **Beat Kangz Electronics**

Maintained and improved audio processing functionality for a hardware- and software-based music production system, 2011-2012

#### **Imagine Research**

Helped develop a machine learning-based sound classification and identification system, 2010–2012

#### SacredAgent

Created a musical event detection system which algorithmically demarcates beats and changes in instrumentation, dynamics, and melody, 2010

## WOBC, Oberlin College Radio

Worked as Engineer, 2007–2008, Station Manager, 2008–2009, and Web Administrator, 2009

#### eBay

Employed as summer intern in user interface design department and Musical Instrument category management team, 2004

## Academic Service

## Late Breaking/Demo and Unconference Chair

Reviewed all submissions for the late breaking/demo session and coordinated the unconference at the 17th International Society for Music Information Retrieval Conference, 2016

## Columbia Neural Network Research Group and Seminar Series

Organized and presented paper discussions, tutorials, and seminars on neural networks, 2014–2016

## **Crucial Python**

Curated a seminar series on obscure but useful aspects of the Python programming language, 2014

## Hacking Audio and Music Research (HAMR)

Started a series of hackathons where researchers rapidly prototype new ideas over the course of a weekend; past HAMRs have been held at Columbia University, Dartmouth College, Drexel University, and Academia Sinica, 2013–present

## Intern Supervisor

Oversaw summer interns working on Music Information Retrieval research projects, 2013–2016

KZSU, Stanford University Radio Developed web applications and a music fingerprinting system, 2009–2010

Mathematics Tutor Assisted students studying algebra and linear algebra, 2008–2009

**Engineering People of Oberlin Club** Served as the Electrical Engineering group coordinator and web administrator, 2008–2009

**Oberlin Student Cooperative Association Website Coordinator** Maintained the website for Oberlin's eating and living cooperative organization, 2006–2007

# Reviewing

International Society for Music Information Retrieval Conference, 2014–2017 Journal of New Music Research, 2016 EURASIP Journal on Audio, Speech, and Music Processing, 2015 IEEE International Symposium on Information Theory, 2014

# Additional Coursework

Music Information Retrieval Workshop, Stanford, CA Summer workshop covering machine learning and audio feature extraction, 2010

## Rochester Community and Technical College, Rochester, MN

Courses in studio recording and electronic music composition, 2002-2004

# Software Libraries

mir\_eval, a simple-to-use reference implementation of many music information retrieval metrics. lasagne, a library for constructing neural networks in Theano.

pretty\_midi, utility classes and functions for easily creating, manipulating, and analyzing MIDI data.

librosa, DSP routines for audio and music signal analysis.