# Levent Sagun

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### Research Interests

Probability theory, statistical physics, and their applications on deep learning. Statistical and geometric properties of loss functions in machine learning.

### Education

- 2011 2017 Ph.D. in Mathematics, Courant Institute of Mathematical Sciences, New York University

  Thesis title: Explorations on High Dimensional Landscapes: Spin Glasses and Deep Learning

  Academic advisors: Gérard Ben Arous and Yann LeCun
- 2006 2011 B.S. in Mathematics, Boğaziçi University, Istanbul, Turkey
   Double major: B.S. in Physics
   Exchange program: Columbia University, New York, Fall 2009
   Graduated first rank in the Faculty of Arts and Sciences, Class of 2011
- 2001 2006 High School, İstanbul Lisesi, Istanbul, Turkey

## Academic Employment

- 2018 2019 Postdoctoral Fellow, École Polytechnique Fédérale de Lausanne, Switzerland Simons Collaboration on Cracking the Glass Problem Part II
- 2017 2018 Postdoctoral Fellow, École Normale Supérieure Paris & CEA Saclay, France Simons Collaboration on Cracking the Glass Problem Part I
- 2015 2016 Teaching Assistant, Center for Data Science, New York University
- 2011 2017 Research & Teaching Assistant, Department of Mathematics, Courant Institute, NYU

## **Industry Employment**

2016 - 2017 Research Intern and Contractor, Facebook AI Research, New York Project: Local geometry of solutions & effects of noisy algorithms in deep learning. Manager: Léon Bottou

## Papers

Stefano Spigler, Mario Geiger, Stéphane d'Ascoli, Levent Sagun, Giulio Biroli, Matthieu Wyart. A jamming transition from under- to over-parametrization affects loss landscape and generalization. Integration of Deep Learning Theories Workshop at NeurIPS, 2018.

David Lopez-Paz, Levent Sagun. Easing non-convex optimization with neural networks. Workshop Track at ICLR, 2018.

Marco Baity-Jesi, Levent Sagun, Mario Geiger, Stefano Spigler, Gérard Ben Arous, Chiara Cammarota, Yann LeCun, Matthieu Wyart, Giulio Biroli. Comparing Dynamics: Deep Neural Networks versus Glassy Systems. Conference Paper at ICML, 2018.

Levent Sagun, Utku Evci, V. Uğur Güney, Yann Dauphin, Léon Bottou. Empirical Analysis of the Hessian of Over-Parametrized Neural Networks. Workshop Track at ICLR, 2018.

Levent Sagun, Thomas Trogdon, Yann LeCun. Universal halting times in optimization and machine learning. Optimization Workshop at ICML, 2016; and Quart. Appl. Math., 76, 289-301, 2018.

Andrew J. Ballard, Ritankar Das, Stefano Martiniani, Dhagash Mehta, Levent Sagun, Jacob D. Stevenson, David J. Wales. Perspective: Energy Landscapes for Machine Learning. *Phys. Chem. Chem. Phys.*, **19**, 12585-12603, 2017.

Matthew Dunn, Levent Sagun, Hale Şirin, Daniel Chen. Early Predictability of Asylum Court Decisions. ML and the Law, ICAIL Pages 233-236, 2017.

Pratik Chaudhari, Anna Choromanska, Stefano Soatto, Yann LeCun, Carlo Baldassi, Christian Borgs, Jennifer Chayes, Levent Sagun, Riccardo Zecchina. Entropy-SGD: Biasing Gradient Descent Into Wide Valleys. Conference Track at ICLR, 2017.

Levent Sagun, Uğur Güney, Gérard Ben Arous, Yann LeCun. Explorations on high dimensional landscapes. Workshop Track at ICLR, 2015.

### Preprints

Mario Geiger, Stefano Spigler, Stéphane d'Ascoli, Levent Sagun, Marco Baity-Jesi, Giulio Biroli, Matthieu Wyart. The jamming transition as a paradigm to understand the loss landscape of deep neural networks. Preprint, available at arXiv:1809.09349, 2018.

Matthew Dunn, Levent Sagun, Mike Higgins, Uğur Güney, Volkan Cirik, Kyunghyun Cho. SearchQA: A New Q&A Dataset Augmented with Context from a Search Engine. Preprint, available at arXiv:1704.05179, 2017.

Levent Sagun, Léon Bottou, Yann LeCun. Eigenvalues of the Hessian in Deep Learning: Singularity and Beyond. Preprint, available at arXiv:1611.07476, 2017.

### Reviewer duties

ICLR, JMLR, COLT, NeurIPS, TPAMI, SIAM Journal, Cambridge University Press

### Talks and Presentations

A jamming transition from under- to over-parametrization affects loss landscape and generalization, NeurIPS Workshop on Integration of Deep Learning Theories, Montreal, December 2018

Over-parametrization in NNs: observations and a definition, Google Brain, Montreal, November 2018

Over-parametrization in NNs: observations and a definition, FAIR, Montreal, November 2018

Over-parametrization in NNs: observations and a definition, MILA, Montreal, November 2018

An empirical look at the loss landscape: shape, dynamics, and loose ends, Statistical Physics and Machine Learning back together, Institut d'Études Scientifiques de Cargèse, Corsica, August 2018

Over-parametrization in Deep Learning, Institut für Theoretische Physik, Heidelberg, July 2018

Easing non-convex optimization with neural networks, ICLR 2018 Poster, May 2018

Empirical Analysis of the Hessian of Over-Parametrized Neural Networks, ICLR 2018 Poster, May 2018 Shape and Dynamics of the Loss Landscape, CILVR Lab Meetings, NYU, New York, April 2018 Shape and Dynamics of the Loss Landscape, High-Dimensional Dynamics Workshop, New York, April 2018 Comparing Dynamics: Deep Neural Networks versus Glassy Systems, Mathematics, Information and Com-

Over-parametrization in Deep Learning, Invited Visit at Google Brain, Zurich, January 2018

Over-parametrization in Deep Learning, Télécom ParisTech, Paris, November 2017

Over-parametrization in Deep Learning, Université Paris-Sud, Paris, November 2017

Over-parametrization in Deep Learning, Facebook AI Research, Paris, October 2017

Over-parametrization in Deep Learning, ENS, Paris, October 2017

putation Seminar, NYU, New York, March 2018

The Role of Over-Parametrization in Optimization, Nonlinear and Stochastic Optimization at SIAM Conference on Optimization, Vancouver, May 2017

Singularity of the Hessian in deep learning, CILVR Lab Meetings, NYU, New York, November 2016 Universality in Halting Time, Spotlight talk at Optimization Workshop, ICML, New York, June 2016 Universality in Halting Time and Optimization, CILVR Lab Meetings, NYU, New York, April 2016 Explorations on High Dimensional Landscapes, Spotlight presentation, MLSS Kyoto, September 2015 Explorations on High Dimensional Landscapes, Poster presentation, DLSS, U. of Montreal, August 2015 Explorations on High Dimensional Landscapes, Poster presentation, ICLR, San Diego, May 2015 Optimization in High Dimensional Landscapes, ML Seminar, Boğaziçi University, January 2015 High Dimensional Landscapes: Spin Glasses and Deep Learning, ML Seminar, NYU, September 2014 Critical Points in High Dimensional Landscapes, NCAP Presentations by Participants, U of T, August 2014 An Introduction to Longest Increasing Subsequences, Boğaziçi University, June 2011 Insight into Theory of Large Deviations, Department of Mathematics, Boğaziçi University, May 2010

## Educational Experience

Statistical Physics and Machine Learning back together, Institut d'Études Scientifiques de Cargèse, Corsica, August 2018

Conjugate Gradient Method, Student Seminars in Mathematics and Physics, Boğazici University, April 2010

Deep Learning and Statistical Physics, Beg Rohu Summer School, June 2018

Machine Learning Summer School, University of Kyoto, September 2015

Deep Learning Summer School, University of Montreal, August 2015

CIFAR Neural Computation & Adaptive Perception Summer School, University of Toronto, August 2014 Workshop on Stochastic Gradient Methods, IPAM, February 2014

St. Petersburg School in Probability and Statistical Physics, Chebyshev Laboratory, June 2012

Minicourse on Compressed Sensing by Emmanuel Candès, University of Cambridge, March 2011

Summer School on Complex Systems, Institute for Theoretical and Applied Physics, Summer 2010

Summer School on Computational Solution of Inverse Problems, Helsinki University, Summer 2010

Summer School on Dynamical Systems and Their Applications, Utrecht University, Summer 2009

Independent Study on Dynamical Systems, Boğaziçi University, Summer 2009

## Teaching Experience

Recitation leader, Statistical and Mathematical Methods, NYU - Center for Data Science, Fall 2016

Recitation leader, Theory of Probability, Courant Institute, Fall 2016

Recitation leader, Machine Learning, NYU - Center for Data Science, Fall 2015

Recitation leader, Statistical and Mathematical Methods, NYU - Center for Data Science, Fall 2015

Recitation leader, Probability and Statistics, Courant Institute, Spring 2015

Recitation leader, Theory of Probability, Courant Institute, Fall 2014

Teaching assistant, Introduction to Mathematical Analysis II, Courant Institute, Spring 2014

Instructor for the Written Exam Workshop, Courant Institute, Fall 2013 Teaching Assistant for Statistics and Probability, Boğaziçi University, 2009-2010

## Honors, Awards & Fellowships

MacCracken Fellowship, New York University, 2011-2016 Dora Aksoy Award, Department of Mathematics, Boğaziçi University, 2011 Hilmi Tolun Award, Faculty of Arts and Sciences, Boğaziçi University, 2011 Honorable Mention,  $9^{th}$  National Mathematical Olympiads, Akdeniz University, Antalya, Turkey, 2004 Silver Medal,  $5^{th}$  National Mathematical Olympiads for Junior High School Students, TÜBİTAK, 2001

### References

#### Research

### Gérard Ben Arous - benarous@cims.nyu.edu

Professor of Mathematics, Courant Institute of Mathematical Sciences, NYU Associate Provost for the Quantitative Disciplines, Global Network Professor of Mathematics, NYU Shanghai Relationship: PhD thesis advisor

#### Léon Bottou - leonb@fb.com

Research Lead, Facebook AI Research, New York Visiting Research Professor, Computer Science Department, NYU Relationship: Manager at FAIR and PhD thesis co-advisor

### Giulio Biroli - giulio.biroli@ens.fr

Professor of Theoretical Physics

Laboratoire de Physique Statistique, École Normale Supérieure, PSL Research University, Paris, France Relationship: Postdoc advisor

### *Teaching*

#### Carlos Fernandez-Granda - cfgranda@cims.nyu.edu

Assistant Professor of Mathematics and Data Science Courant Institute of Mathematical Science and Center for Data Science NYU Relationship: I have been his teaching assistant at the Center for Data Science

Last updated: December 17, 2018