







# LAWRENCE CHILLRUD

## Senior Programmer

 Interpretable Machine Learning for Precision Medicine  
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### EDUCATION

9/2021 – 5/2022	<b>Columbia University</b> <i>Post-baccalaureate Studies Program: Non-degree</i>	School of Professional Studies New York, NY
9/2016 – 5/2020	<b>Columbia University</b> <i>Bachelor of Arts in Computer Science, Intelligent Systems</i> GPA: 3.74 / 4.00	Columbia College New York, NY

### RESEARCH EXPERIENCE

10/2020 – Present	<b>Senior Programmer</b> <i>Environmental Health Sciences</i>	Columbia Mailman School of Public Health <i>PI: Dr. <a href="#">Marianthi-Anna Kioumourtzoglou</a></i>
<ul style="list-style-type: none"><li>• Continued work on Principal Component Pursuit w/ Drs. <a href="#">John Wright</a> &amp; <a href="#">Jeff Goldsmith</a>.</li><li>• Investigating convex &amp; non-convex approaches to matrix decomposition, dim reduction.</li><li>• Leveraging Gaussian processes to design faster cross-validated grid searches.</li><li>• Developing Bayesian non-parametric ensemble model for uncertainty characterization.</li><li>• Utilizing computer vision algorithms to track changes in urban communities.</li><li>• Conducting extensive code reviews for academic papers (reviewed over 9,000 lines).</li><li>• Cleaning, visualizing &amp; documenting public health datasets for various research questions.</li><li>• Aiding in writing, editing of scientific papers &amp; abstracts. Presenting work at conferences.</li><li>• Exploring methods for source apportionment: PCP, PCA, Autoencoders, Factor Analysis.</li><li>• Building environmental / epidemiological health models and analyses.</li></ul>		
6/2020 – 10/2020	<b>EHS Research Assistant</b> <i>Environmental Health Sciences</i>	Columbia Mailman School of Public Health <i>PI: Dr. <a href="#">Marianthi-Anna Kioumourtzoglou</a></i>
<ul style="list-style-type: none"><li>• Adapted &amp; extended Principal Component Pursuit (PCP) for environmental mixtures data.</li><li>• Benchmarked PCP's computational efficiency, interrogated its mathematical foundations.</li><li>• Developed novel, user-friendly R packages for implementation of environmental PCP.</li><li>• Designed &amp; ran synthetic &amp; applied experiments to assess PCP's statistical performance.</li></ul>		
6/2020 – 10/2020	<b>NLP Research Assistant</b> <i>Computer Science Department</i>	Columbia University <i>PI: Dr. <a href="#">Kathleen McKeown</a></i>
<ul style="list-style-type: none"><li>• Developed, trained, evaluated fact-checking model for COVID-19 &amp; climate-change.</li><li>• Worked on transformer architectures (BERT), few-shot learning, claim detection, named entity recognition, unsupervised data augmentation, transfer learning for fact-checking.</li><li>• Built a COVID-19-specific dataset to train and test RoBERTa-based fact-checking model.</li><li>• Scraped millions of online news articles for COVID-19 claims &amp; mapped to scientific papers.</li><li>• Wrote IRB protocol to receive approval for human annotators to tag fact-checking dataset.</li><li>• Implemented &amp; maintained user-friendly annotation interface to facilitate annotations.</li><li>• Assisted in writing, editing of scientific paper detailing our novel fact-checking pipeline.</li></ul>		

## **PUBLICATIONS**

### *Papers*

1. Makkar A, Liu JZ, Kioumourtzoglou M-A, Coull B, Rowland ST, **Chillrud LG**, Paisley J. Fast Bayesian Nonparametric Ensemble Using Random Fourier Features. Submitted to *AISTATS*, 2022.
2. Gibson EA, Zhang J, Yan J, **Chillrud LG**, Benavides JP, Nunez Y, Herbstman JB, Goldsmith J, Wright J, Kioumourtzoglou M-A. [Principal Component Pursuit for Pattern Identification in Environmental Mixtures](#). Under review at *Environmental Health Perspectives*, 2021.
3. Rowland ST, **Chillrud LG**, Boehme AK, Wilson A, Rush J, Just AC, Kioumourtzoglou M-A. [Can Weather Help Explain ‘Why Now?’: The Potential Role of Hourly Temperature as a Stroke Trigger](#). *Environmental Research*, 2021.
4. Wang G, **Chillrud LG**, McKeown KR. [Evidence based Automatic Fact-Checking for Climate Change Misinformation](#). *SocialSens Workshop on The International AAAI Conference on Web and Social Media 2021*.

### *Abstracts*

5. **Chillrud LG**, Gibson EA, Nunez Y, Colgan R, Tao RH, Zhang J, Yan J, Wright J, Goldsmith J, Kioumourtzoglou M-A. Principal Component Pursuit for Pattern Recognition from Incomplete Environmental Data. Accepted to *ENAR 2022*, Houston, March 27-30, 2022.
6. **Chillrud LG**, Gibson EA, Nunez Y, Colgan R, Tao RH, Zhang J, Yan J, Wright J, Goldsmith J, Kioumourtzoglou M-A. [Principal Component Pursuit for Exposure Pattern Recognition: An Application to Persistent Organic Pollutants and Leukocyte Telomere Length](#). *ISEE 2021*, NYC, August 23-26.
7. Rowland ST, **Chillrud LG**, Boehme AK, Wilson A, Rush J, Just AC, Kioumourtzoglou M-A. [Can Weather Help Explain ‘Why Now?’: The Potential Role of Hourly Temperature as a Stroke Trigger](#). *ISEE 2021*, NYC, August 23-26.
8. Tao RH, Nunez Y, **Chillrud LG**, Rowland ST, Boehme AK, Kioumourtzoglou M-A. [Source-specific Fine Particulate Matter and Hospitalization due to Myocardial Infarction](#). *ISEE 2021*, NYC, August 23-26.
9. Rowland ST, Makkar A, Benavides JP, **Chillrud LG**, Coull B, Fiore A, Henze D, Martin R, Milly GP, Donkelaar Av, Parks RM, Paisley J, Kioumourtzoglou M-A. [Uncertainty characterization in PM<sub>2.5</sub> Predictions Across the Contiguous US](#). *ISEE 2021*, NYC, August 23-26.
10. Benavides JP, Nunez Y, **Chillrud LG**, Gibson EA, Kioumourtzoglou M-A. [Pre- and Postnatal Urban Exposure Patterns and Childhood Neurobehavior](#). *Exposome Data Challenge*, ISGlobal, April 28-30, 2021.

### *Poster Presentations*

11. **Chillrud LG**, Gibson EA, Nunez Y, Colgan R, Tao RH, Zhang J, Yan J, Wright J, Goldsmith J, Kioumourtzoglou M-A. Principal Component Pursuit for Pattern Recognition from Incomplete Environmental Data. Accepted to *ENAR 2022*, Houston, March 27-30, 2022.
12. **Chillrud LG**, Gibson EA, Nunez Y, Colgan R, Tao RH, Zhang J, Yan J, Wright J, Goldsmith J, Kioumourtzoglou M-A. [Principal Component Pursuit for Exposure Pattern Recognition: An Application to Persistent Organic Pollutants and Leukocyte Telomere Length](#). *ISEE 2021*, NYC, August 23-26.
13. Benavides JP, Nunez Y, **Chillrud LG**, Gibson EA, Kioumourtzoglou M-A. [Pre- and Postnatal Urban Exposure Patterns and Childhood Neurobehavior](#). *Exposome Data Challenge*, ISGlobal, April 28-30, 2021.

## **TECHNICAL SKILLS**

**Languages with Advanced Proficiency:**

Python, R, Java,  $\text{\LaTeX}$

**Languages with Basic Proficiency:**

C, C++, HTML, CSS, MATLAB, Bash, Zsh

**Operating Systems:**

UNIX, macOS

**Version Control Systems:**

GitHub

**Databases**

MongoDB, NoSQL

**Certifications**

HIPAA, CITI, Human Subjects Protection

**Experience Writing & Editing**

academic papers, IRB protocols

**Machine Learning Python Libraries:**

TensorFlow, Keras, PyTorch, Scikit-learn, Hugging Face Transformers, NumPy, SciPy, Pandas, Matplotlib, Seaborn

**Developer Tools:**

iTerm, Vim, tmux, RStudio, Jupyter Notebook, Eclipse, Google Cloud Platform, Homebrew, Conda

## **RELEVANT COURSEWORK**

### **COMPUTER SCIENCE**

- Statistical Machine Learning\*\*
- Machine Learning
- Computational Genomics
- Natural Language Processing
- Artificial Intelligence
- Analysis of Algorithms
- Computer Science Theory
- Advanced Programming
- Computer Systems
- Data Structures & Algorithms

### **MATHEMATICS**

- Probability & Statistics\*
- Linear Algebra
- Calculus I, II, & III
- Discrete Mathematics
- Number Theory
- Cryptography
- Real Analysis I\*\*
- Bayesian Statistics\*\*
- Analysis & Optimization\*\*

### **OTHER**

- Geochemistry
- Organic Chemistry I
- General Chemistry I & II
- General Chemistry Lab
- Death Valley Geology
- Intro Linguistics

\*Taken in the fall 2021 semester; \*\**might be taken* in the spring 2022 semester; as a student at **Columbia University's School of Professional Studies**, in the *Post-baccalaureate Studies Program*.

## **OTHER PROJECTS**

11/2020

### **Scraping Georgia Jails for Georgia Get Out the Vote**

Wrote a Python web-crawler to scrape Georgia's jails for information needed to help register incarcerated voters. [Read more here.](#)

10/2020

### **RoBERTa for Claim Detection**

Fine-tuned RoBERTa under-the-hood to identify and rank claims worth fact-checking. Implemented with PyTorch and Scikit-learn. [Read more here.](#)

5/2020

### **Automatic Diagnosis of COVID-19 Chest X-rays with Neural Nets**

Trained a CNN via transfer learning (TensorFlow) to diagnose patient chest x-rays from: COVID-19, no condition, viral-, or bacterial-pneumonia. [Read more here.](#)

5/2020

### **SARS-CoV-2 Sequence Analysis**

Identified conserved RNA secondary structures across coronavirus spike proteins in a sequence analysis of SARS-CoV-2. [Read more here.](#)

## **REFERENCES**

References are available upon request. Transcript is available upon request.