Cole Trapnell, Ph.D.

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CONTACT

(206) 616-6898 Information Foege Building Room S333C coletrap@uw.edu Department of Genome Sciences University of Washington Seattle, WA, 98105, USA APPOINTMENT University of Washington Assistant Professor of Genome Sciences, July 2014 - present Training Harvard University Postdoctoral Training, 2010 - 2014 Department of Stem Cell and Regenerative Biology Mentor: John L. Rinn University of Maryland, College Park Ph.D. Computer Science, 2010 Advisors: Steven Salzberg, Lior Pachter University of Maryland, College Park B.S. Computer Science, 2005 B.S. Mathematics, 2005 Professional University of Washington 2014 - pres. EXPERIENCE Assistant Professor, Department of Genome Sciences Harvard University 2010 - 2014 Postdoctoral Fellow, Department of Stem Cell and Regenerative Biology The Broad Institute of MIT and Harvard 2010 - 2014 Visiting Postdoctoral Fellow University of California, Berkeley 2008 - 2010 Visiting Student Researcher, Department of Mathematics University of Maryland, College Park 2006 - 2010 Graduate Research Assistant, Department of Computer Science 2005 - 2006 Actuate Corporation Software Engineer TopGun Software/LeverageFX 2002 - 2005 Co-founder and Software Engineer U.S. Army Research Laboratory 1999 - 2002 Student Engineer

Honors and

ISCB Overton Prize, 2018

AWARDS

NIH Director's New Innovator Award, 2015

Alfred P. Sloan Foundation Research Fellowship, 2015

Damon Runyon Dale F. Frey Award for Breakthrough Scientists, 2014

Damon Runyon Postdoctoral Fellowship, 2011-2014

Finalist, Burroughs-Wellcome Career Award at the Scientific Interface, 2013 Genome Biology Award, *BioMed Central*, 2010. (Bowtie, with Langmead, *et al*) Next-Generation Sequencing Paper of the Year, 2009. *Bioinformatics* (TopHat)

Teaching Excellence Award, 2007, University of Maryland Computer Science Department

Software

Monocle: Time-series and differential expression analysis for single-cell RNA-Seq.

Cufflinks: Transcriptome assembly and differential expression with RNA-Seq.

Citations for related article[†] Trapnell et al, 2010: 4,402

Highlighted as a notable breakthrough in Computational Biology, 2010.

See: H. Craig Mak, Nature Biotechnology Vol. 29, 45 (2011)

TopHat: Spliced short read alignment for RNA-Seq.

Citations for related article[†] Trapnell et al, 2009: 4,933

Bowtie: Ultrafast short read mapping (with Ben Langmead)

Citations for related article[†] Langmead et al, 2009: 8,578

Spats: RNA structure with SHAPE-Seq (with Sharon Aviran)

MUMmerGPU: Fast sequence alignment on the GPU (with Michael Schatz)

TEACHING

UW GENOME 551: Gene Regulation

PATENTS

High-throughput methodology for identifying RNA-Protein interactions transcriptomewide. (issued: 13/911,429)

PUBLICATIONS

Journal Articles:

- Darren A. Cusanovich*, Andrew J. Hill*, Delasa Aghamirzaie, Riza M. Daza, Hannah A. Pliner, Joel B. Berletch, Galina N. Filippova, Xingfan Huang, Lena Christiansen, William S. DeWitt, Choli Lee, Samuel G. Regalado, David F. Read, Frank J. Steemers, Christine M. Disteche, Cole Trapnell†, Jay Shendure†, A first generation atlas of in vivo mammalian chromatin accessibility at single cell resolution.
 (in press at Cell)
- 2. Hannah A. Pliner, Jonathan Packer, Jos L. McFaline-Figueroa, Darren Cusanovich, Riza Daza, Sanjay Srivatsan, Xiaojie Qiu, Dana Jackson, Anna Minkina, Andrew Adey, Frank Steemers, Jay Shendure[†], Cole Trapnell[†], Chromatin accessibility dynamics of myogenesis at single cell resolution.

(in press at Molecular Cell)

[†]Google Scholar, as of 11/18/2016

^{*}Equal contribution

[†]Co-corresponding author

- 3. Davide Cacchiarelli[†], Xiaojie Qiu, Sanjay Srivatsan, Michael J. Ziller, Eliah Overbey, Jonna Grimsby, Prapti Pokharel, Ken Livak, Shuqiang Li, Alex Meissner, Tarjei Mikkelsen, John Rinn, **Cole Trapnell**[†], Aligning single-cell developmental and reprogramming trajectories identifies molecular determinants of reprogramming outcome. (in press at *Cell Systems*)
- 4. Ryan M. Mulqueen, Dmitry Pokholok, Steve Norberg, Andrew J. Fields, Duanchen Sun, Kristof A. Torkenczy, Jay Shendure, **Cole Trapnell**, Brian J. O'Roak, Zheng Xia, Frank J. Steemers, Andrew C. Adey, Scalable and efficient single-cell DNA methylation sequencing by combinatorial indexing.

Nature Biotechnology 36, pages 428-431 (2018)

5. Darren Cusanovich*, James Reddington*, David Garfield*, Riza Daza, Raquel Marco-Ferreres, Lena Christiansen, Xiaojie Qiu, Frank Steemers, Cole Trapnell, Jay Shendure†, Eileen Furlong†, The cis-regulatory dynamics of embryonic development at single cell resolution.

Nature 555, 538-542 (2018)

6. Alistair B. Russell, **Cole Trapnell**, Jesse D. Bloom, Extreme heterogeneity of influenza virus infection in single cells.

eLife 7:e32303 (2018)

7. Andrew Hill*, Jose L. McFaline-Figueroa*, Jay Shendure[†], **Cole Trapnell**[†], On the design of CRISPR-based single cell molecular screens.

Nature Methods 15, pages 271274 (2018).

8. Junyue Cao, Jonathan S. Packer, Vijay Ramani, Darren A. Cusanovich, Chau Huynh, Riza Daza, Xiaojie Qiu, Choli Lee, Scott N. Furlan, Frank J. Steemers, Andrew Adey, Robert H. Waterston[†], **Cole Trapnell**[†], Jay Shendure[†], Comprehensive single cell transcriptional profiling of a multicellular organism by combinatorial indexing.

Science 357: 6352 661-667. (2017)

 Xiaojie Qiu, Qi Mao, Ying Tang, Li Wang, Raghav Chawla, Hannah Pliner, Cole Trapnell, Reversed graph embedding resolves complex single-cell developmental trajectories.

Nature Methods, 14, 979982. (2017)

10. Jin Zhang, Sutheera Ratanasirintrawoot, Sriram Chandrasekaran, Zhaoting Wu, Scott B Ficarro, Chunxiao Yu, Christian A Ross, Davide Cacchiarelli, Qing Xia, Marc Seligson, Gen Shinoda, Wen Xie, Patrick Cahan, Longfei Wang, Shyh-Chang Ng, Supisara Tintara, Cole Trapnell, Tamer Onder, Yuin-Han Loh, Tarjei Mikkelsen, Piotr Sliz, Michael A Teitell, John M Asara, Jarrod A Marto, Hu Li, James J Collins, George Q Daley, LIN28 regulates stem cell metabolism and conversion to primed pluripotency.

Cell Stem Cell 19:1 66-80. (2017)

11. Xiaojie Qiu, Andrew Hill, Jonathan Packer, Dejun Lin, Yian Ma, Cole Trapnell, Census enables lineage-, isoform-, and allele-resolution mRNA quantification in single cells.

Nature Methods 14 (3), 309-315. (2017)

12. Serena Liu and Cole Trapnell. Single-cell transcriptome sequencing: recent advances and remaining challenges.

F1000 Faculty Reviews. (2016) Invited paper.

- 13. Cole Trapnell, Defining cell types and states with single-cell genomics. Genome Research, 25:14911498. (2015) Invited paper.
- 14. Naresh K. Hanchate, Kunio Kondoh, Zhonghua Lu, Donghui Kuang, Xiaolan Ye, Xiaojie Qiu, Lior Pachter, **Cole Trapnell**[†], Linda B. Buck[†], Single-cell transcriptomics reveals receptor transformations during olfactory neurogenesis, *Science*, 350:62-65. (2015)
- 15. Davide Cacchiarelli*, **Cole Trapnell***, Michael J. Ziller*, Magali Soumillon, Marcella Cesana, Rahul Karnik, Zachary D. Smith, Sutheera Ratanasirintrawoot Xiaolan Zhang, Shannan Ho Sui, Zhaoting Wu, Veronika Akopian, Casey A. Gifford, John Doench, John L. Rinn, George Q. Daley, Alexander Meissner, Eric S. Lander, Tarjei S. Mikkelsen, Integrative analyses of human reprogramming reveal dynamic nature of induced pluripotency.

Cell, 16:2 412-424 (2015)

- Darren A. Cusanovich, Riza Daza, Andrew Adey, Hannah Pliner, Lena Christiansen, Kevin L. Gunderson, Frank J. Steemers, Cole Trapnell, Jay Shendure, Multiplex single cell profiling of chromatin accessibility by combinatorial cellular indexing. Science, 348: 6237 910-914. (2015)
- 17. Takuji Suzuki, Paritha Arumugam, Takuro Sakagami, Nico Lachmann, Claudia Chalk, Anthony Sallese, Shuichi Abe, **Cole Trapnell**, Brenna Carey, Thomas Moritz, Punam Malik, Carolyn Lutzko, Robert E. Wood, and Bruce C. Trapnell, Pulmonary Macrophage Transplantation Therapy.

Nature, 514: 450-453. (2014)

18. Cole Trapnell*, Davide Cacchiarelli*, Jonna Grimsby, Prapti Pokharel, Shuqiang Li, Michael Morse, Niall J. Lennon, Kenneth J. Livak, Tarjei S. Mikkelsen, John L. Rinn, The dynamics and regulators of cell fate decisions are revealed by pseudotemporal ordering of single cells.

Nature Biotechnology, 32: 381-386. (2014)

- 19. Ezgi Hacisuleyman*, Loyal A. Goff*, Cole Trapnell, Adam Williams, Jorge Henao-Mejia, Lei Sun, Patrick McClanahan, David G. Hendrickson, Martin Sauvageau, David R. Kelley, Michael Morse, Jesse Engreitz, Eric S. Lander, Mitch Guttman, Harvey F. Lodish, Richard Flavell, Arjun Raj, John L. Rinn. Topological organization of multichromosomal regions by the long intergenic noncoding RNA Firre Nature Structural & Molecular Biology, 21: 198-206. (2014)
- Ian M. Silverman, Fan Li, Anissa Alexander, Loyal Goff, Cole Trapnell, John L. Rinn, Brian D. Gregory, RNase-mediated protein footprint sequencing reveals protein-binding sites throughout the human transcriptome.
 - Genome Biology 15:R3 (2014)
- 21. Stephen Altschul, Barry Demchak, Richard Durbin, Robert Gentleman, Martin Krzywinski, Heng Li, Anton Nekrutenko, James Robinson, Wayne Rasband, James Taylor, Cole Trapnell, The anatomy of successful computational biology software.

Nature Biotechnology, 31, 894-897. (2013)

22. Casey A Gifford*, Michael J Ziller*, Hongcang Gu, **Cole Trapnell**, Julie Donaghey, Alexander Tsankov, Alex K Shalek, David R Kelley, Alexander A Shishkin, Robbyn Issner, Xiaolan Zhang, Michael Coyne, Jennifer L Fostel, Laurie Holmes, Jim Meldrim, Mitchell Guttman, Charles Epstein, Hongkun Park, Oliver Kohlbacher, John Rinn,

Andreas Gnirke, Eric S Lander, Bradley E Bernstein, Alexander Meissner, Transcriptional and epigenetic dynamics during specification of human embryonic stem cells. *Cell*, 153, 5, 1149-1163. (2013)

23. Daehwan Kim, Geo Pertea, **Cole Trapnell**, Harold Pimentel, Ryan Kelley, Steven L Salzberg, TopHat2: Accurate alignment of transcriptomes in the presence of insertions, deletions and gene fusions.

Genome Biology, 14:R36. (2013)

24. Stefanie A Mortimer, **Cole Trapnell***, Sharon Aviran*, Lior Pachter, Julius B Lucks, SHAPE-Seq: High-Throughput RNA Structure Analysis.

Current Protocols in Chemical Biology DOI: 10.1002/9780470559277.ch120019. (2013)

25. Lei Sun*, Loyal A Goff*, **Cole Trapnell***, Ryan Alexander, Kinyui Alice Lo, Ezgi Hacisuleyman, Martin Sauvageau, Barbara Tazon-Vega, David R Kelley, David G Hendrickson, Bingbing Yuan, Manolis Kellis, Harvey F Lodish, John L Rinn, Long noncoding RNAs regulate adipogenesis.

Proc. of the National Academy of Sciences 110, 9, 3387-3392. (2013)

26. Cole Trapnell*, David Hendrickson*, Martin Sauvageau, Loyal Goff, John Rinn, Lior Pachter, Differential analysis of gene regulation at transcript resolution with RNA-seq.

Nature Biotechnology, 31, 4653. (2013)

27. Cole Trapnell, Adam Roberts, Loyal Goff, Geo Pertea, Daehwan Kim, David R. Kelley, Harold Pimentel, Steven L. Salzberg, John L. Rinn, Lior Pachter, Differential gene and transcript expression analysis of RNA-Seq experiments with TopHat and Cufflinks.

Nature Protocols, 7, 562578. (2012)

28. Tim R. Mercer, Daniel J. Gerhardt, Marcel E. Dinger, Joanna Crawford, **Cole Trap-nell**, Jeffrey A. Jeddeloh, John S. Mattick, and John L. Rinn, Targeted RNA sequencing reveals the deep complexity of the human transcriptome.

Nature Biotechnology, 30: 99-104. (2012)

29. Moran N. Cabili, **Cole Trapnell**, Loyal Goff, Magdalena Koziol, Barbara Tazon-Vega, Aviv Regev and John L. Rinn, Integrative annotation of human large intergenic noncoding RNAs reveals global properties and specific subclasses.

Genes and Development, 2011.25. (2011)

30. Adam Roberts, Harold Pimentel, **Cole Trapnell**[†], and Lior Pachter[†], Identification of novel transcripts in annotated genomes using RNA-Seq.

Bioinformatics, 27 (17): 2325-2329. (2011)

31. Julius B. Lucks, Stefanie A. Mortimer, Cole Trapnell, Shujun Luo, Sharon Aviron, Lior Pachter, Jennifer A. Doudna, and Adam P. Arkin, SHAPE-Seq: Multiplexed RNA Secondary and Tertiary Structure Determination.

Proc. of the National Academy of Sciences 108, 27. (2011)

32. Sharon Aviran, **Cole Trapnell**, Julius B. Lucks, Stefanie A. Mortimer, Jennifer A. Doudna, Adam P. Arkin, and Lior Pachter, Modeling and automation of SHAPE-Seq analysis.

Proc. of the National Academy of Sciences, 108, 27. (2011)

33. Manuel Garber, Manfred Grabherr, Mitchell Guttman, and **Cole Trapnell**, Computational Methods for Transcriptome Annotation and Quantification.

Nature Methods, 8, 469-477. (2011)

34. Adam Roberts, **Cole Trapnell**, Julie Donaghey, John L. Rinn, and Lior Pachter, Improving RNA-Seq expression estimates by correcting for fragment bias.

Genome Biology 12:R22. (2011)

35. Cole Trapnell, Brian Williams, Geo Pertea, Ali Mortazavi, Gordon Kwan, Marijke J. van Baren, Steven L. Salzberg, Barbara Wold, and Lior Pachter, Transcript assembly and quantification by RNA-Seq reveals unannotated transcripts and isoform switching during cell differentiation.

Nature Biotechnology, 28, 511-515. (2010)

36. Robert K. Bradley*, Xiao-Yong Li*, **Cole Trapnell**, Stuart Davidson, Lior Pachter, Hou Cheng Chu, Mark D. Biggin, and Michael B. Eisen, Binding site turnover produces pervasive quantitative changes in transcription factor binding between closely related Drosophila species.

PLoS Biology, 8(3): e1000343. (2010)

37. Cole Trapnell and Steven L. Salzberg, How to map billions of short reads onto genomes.

Nature Biotechnology, 27, 455-457. (2009)

38. Cole Trapnell*, Michael C. Schatz*, Optimizing Data Intensive GPGPU Computations for DNA Sequence Alignment.

Parallel Computing, 35:8-9. (2009)

39. Cole Trapnell, Lior Pachter, and Steven L. Salzberg, TopHat: discovering splice junctions with RNA-Seq.

Bioinformatics 25(9):1105-1111. (2009)

 Ben Langmead, Cole Trapnell, Mihai Pop, and Steven L. Salzberg, Ultrafast and memory-efficient alignment of short DNA sequences to the human genome. Genome Biology, 10:R25. (2009)

41. Steven L. Salzberg *et al*, Genome sequence and rapid evolution of the rice pathogen Xanthomonas oryzae pv. oryzae PXO99.

BMC Genomics 9:204. (2008)

42. Michael C. Schatz*, **Cole Trapnell***, Arthur L. Delcher, and Amitabh Varshney, High-throughput sequence alignment using Graphics Processing Units.

BMC Bioinformatics, 8:474. (2007)

Conference Papers:

Bruce C. Trapnell, Jr, A Peer-to-Peer Blacklisting Strategy Inspired by Leukocyte-Endothelial Interaction.

Proceedings of the Fourth International Conference on Artificial Immune Systems (2005)

Book Chapters:

Mark Neal and **Bruce C. Trapnell, Jr**, Go Dutch: Exploit Interactions and Environments with Artificial Immune Systems.

In Silico Immunology, Springer (2007)