# Vicente Ordóñez-Román (publishes as Vicente Ordonez)

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RESEARCH INTERESTS My research lies at the intersection of Computer Vision, Natural Language Processing and Machine Learning. I am especially interested in analyzing, and mining useful human insights from enormous amounts of images with associated text to improve visual recognition. I am also interested in building efficient visual recognition models that can perform high-level perceptual tasks for applications in social media, urban computing, and everyday activities. More recently, I am also involved in research on fairness and accountability in machine learning applications.

CURRENT Assistant Professor 2016 - present

POSITION University of Virginia (UVA), Charlottesville, Virginia.

Department of Computer Science, School of Engineering and Applied Science.

I am leading a new UVA Computer Vision group.

Previous Visiting Research Fellow 2015 - 2016

POSITION Allen Institute for Artificial Intelligence (AI2), Seattle, Washington.

I worked at the intersection of Vision and Language in the Computer Vision group led by Prof. Ali Farhadi from the University of Washington (UW).

EDUCATION The University of North Carolina at Chapel Hill (UNC) 2013 - 2015

Doctor of Philosophy in Computer Science

Thesis: Language and Perceptual Categorization in Computational Visual Recognition

Committee: Tamara L. Berg (advisor), Alexander C. Berg, Jan-Michael Frahm,

Yejin Choi (University of Washington), Alexei A. Efros (UC Berkeley)

Stony Brook University, The State University of New York (SUNY) 2009 - 2013

Master of Science in Computer Science

Escuela Superior Politécnica del Litoral (ESPOL), Ecuador. 2003 - 2008

Computer Engineering Degree (GPA: 9.22/10.0)

AWARDS Google Faculty Research Award 2017.

IBM Faculty Award 2017.

Best Long Paper Award, 2017.

• Intl. Conf. on Empirical Methods in Natural Language Processing (EMNLP), 2017.

Research Highlight of the Communications of the ACM, March 2016 Issue.

Allen Institute for Artificial Intelligence Hackathon 2015 – *Peer Favorite Award*.

Best Paper Award – IEEE Marr Prize 2013.

• International Conference in Computer Vision (ICCV), 2013.

Yahoo! Key Scientific Challenges Award, 2012.

Renaissance Technologies Fellowship, 2009 - 2011.

Philantropic Society Medal, Guayaquil, Ecuador, 2007.

Top GPA in the Computer Engineering Program, ESPOL, 2004 - 2007.

INDUSTRY EXPERIENCE Microsoft Research, Cambridge, Massachusetts.

Summer 2014

Research Intern in the Computer Vision Group

Large scale data-driven scene parsing using deep learning features.

I was fortunate to work with Ce Liu and Michael Rubinstein.

eBay Research Labs, San Jose, California.

Summer 2013

Research Intern in the Computer Vision Group

Worked on attribute predictions on catalog image and text collections

in the Mantis Computer Vision group. My mentors were

Robinson Piramuthu and Vignesh Jagadeesh.

Google, Mountain View, California.

Summer 2011

Software Engineering Intern in the Android Multimedia Content Analysis Group
Automatic organization of personal image collections using visual features.
This work later evolved into the Google+ Beautiful Movies made Auto Awesomely.

My mentors were Rodrigo Carceroni and Wei Hua.

Google, Mountain View, California.

Spring 2008, Summer 2008

Software Engineering Intern in Google Earth

Developed code for automated quality analysis of satellite images in the imagery database group for Google Earth and Google Maps. My mentor was Rodrigo Carceroni.

ACADEMIC EXPERIENCE

# The University of North Carolina at Chapel Hill

2013 - 2015

Research Assistant at the Computer Science Department

Performed research in visually grounded language and extracting visual meaning from large scale noisy collections of text and images. I worked with my advisor Prof. Tamara L. Berg and Prof. Alexander C. Berg.

Stony Brook University (SUNY), Stony Brook, New York.

2010 - 2013

Research Assistant at the Vision and Digital Media Lab

Large scale analysis of text and images, large scale image classification, language generation and eye gaze data analysis. I was part of the research group

of Prof. Tamara L. Berg and also collaborated with Prof. Yejin Choi.

Center for Information Technologies (ESPOL), Guayaquil, Ecuador.

2006 - 2009

Research Assistant at the Technology Enhanced Learning Group

Worked on e-learning and document retrieval under Prof. Xavier Ochoa

and also collaborated briefly with Prof. Erik Duval (KU Leuven)

**PUBLICATIONS** 

Feedback-prop: Convolutional Neural Network Inference under Partial Evidence.

Tianlu Wang, Kota Yamaguchi, Vicente Ordonez.

Int. Conf. on Computer Vision and Pattern Recognition. CVPR 2018.

Salt Lake City, Utah.

Gender Bias in Coreference Resolution: Evaluation and Debiasing Methods.

Jieyu Zhao, Tianlu Wang, Mark Yatskar, Vicente Ordonez, Kai-Wei Chang.

North American Chapter of the Association for Computational Linguistics. NAACL 2018.

short. New Orleans, Louisiana.

Where and Who? Automatic Semantic-Aware Person Composition. Fuwen Tan, Crispin Bernier, Benjamin Cohen, Vicente Ordonez, Connelly Barnes. Winter Conference on Applications of Computer Vision WACV 2018. Lake Tahoe, NV.

Men Also Like Shopping: Reducing Gender Bias Amplification using Corpus-level Constraints. Jieyu Zhao, Tianlu Wang, Mark Yatskar, Vicente Ordonez, Kai-Wei Chang. Empirical Methods on Natural Language Processing. EMNLP 2017. Copenhagen, Denmark. (Oral Presentation) (Best Paper Award)

Obj2Text: Generating Visually Descriptive Language from Object Layouts . Xuwang Yin, Vicente Ordonez. Empirical Methods on Natural Language Processing. EMNLP 2017. Copenhagen, Denmark. (Oral Presentation)

Commonly Uncommon: Semantic Sparsity in Situation Recognition. Mark Yatskar, Vicente Ordonez, Luke Zettlemoyer, Ali Farhadi. Int. Conf. on Computer Vision and Pattern Recognition. CVPR 2017. Honolulu, Hawaii.

XNOR-Net: ImageNet Classification Using Binary Convolutional Neural Networks. Mohammad Rastegari, Vicente Ordonez, Joseph Redmon, Ali Farhadi. European Conference on Computer Vision. ECCV 2016. Amsterdam, Netherlands. (Oral presentation)

Stating the Obvious: Extracting Visual Common Sense Knowledge.

Mark Yatskar, Vicente Ordonez, Ali Farhadi. North American Chapter of the Association of Computational Linguistics. NAACL 2016. short. San Diego, CA (Oral presentation)

Learning to Name Objects.

Vicente Ordonez, Wei Liu, Jia Deng, Yejin Choi, Alexander C. Berg, Tamara L. Berg. Communications of the ACM. March 2016. Vol 59, No. 3. CACM 2016. (Research Highlight, Invited Paper)

Large Scale Retrieval and Generation of Image Descriptions.
V. Ordonez, X. Han, P. Kuznetsova, G. Kulkarni, M. Mitchell, K. Yamaguchi, K. Stratos, A. Goyal, J. Dodge, A. Mensch, H. Daume III, A.C. Berg, Y. Choi, T.L. Berg.
International Journal of Computer Vision. Special Issue on Big Data. IJCV 2016.
(Journal Paper)

Predicting Entry-Level Categories.

Vicente Ordonez, Wei Liu, Jia Deng, Yejin Choi, Alexander C. Berg, Tamara L. Berg. International Journal of Computer Vision - Marr Prize Special Issue. IJCV 2015. (Journal Paper)

ReferitGame: Referring to Objects in Photographs of Natural Scenes. Sahar Kazemzadeh, Vicente Ordonez, Mark Matten, Tamara L. Berg Empirical Methods on Natural Language Processing. EMNLP 2014. Doha, Qatar. (Oral presentation) Learning High-level Judgments of Urban Perception. Vicente Ordonez, Tamara L. Berg European Conference on Computer Vision. ECCV 2014. Zurich, Switzerland.

TreeTalk: Composition and Compression of Trees for Image Descriptions. Polina Kuznetsova, Vicente Ordonez, Tamara L. Berg, Yejin Choi. Transactions of the Association of Computational Linguistics. TACL 2014 Presented at EMNLP 2014. Doha, Qatar. (Oral Presentation, Journal Paper)

FurnitureGeek: Understanding Fine-Grained Furniture Attributes from Freely Associated Text and Tags. Vicente Ordonez, Vignesh Jagadeesh, Wei Di, Anurag Bhardwaj, Robinson Piramuthu. IEEE Winter Conference on Applications of Computer Vision. WACV 2014. Steamboat Springs, CO

From Large Scale Image Categorization to Entry Level Categories. Vicente Ordonez, Jia Deng, Yejin Choi, Alexander C. Berg, Tamara L. Berg. IEEE International Conference on Computer Vision. ICCV 2013. Sidney, Australia. (Oral presentation) (Best Paper Award - Marr Prize) (Selected for publication in the Research Highlights of the Communications of the ACM Magazine)

Generalizing Image Captions for Image-Text Parallel Corpus. Polina Kuznetsova, Vicente Ordonez, Alexander C. Berg, Tamara L. Berg, Yejin Choi. Association for Computational Linguistics. ACL 2013. short. Sofia, Bulgaria.

Babytalk: Understanding and Generating Image Descriptions. G. Kulkarni, V. Premraj, V. Ordonez, S. Dhar, S. Li, Y. Choi, A. C. Berg, T. L. Berg. IEEE Transactions on Pattern Analysis and Machine Intelligence. TPAMI 2013. (Journal paper)

Collective Generation of Natural Image Descriptions.
Polina Kuznetsova, Vicente Ordonez, Alexander C. Berg, Tamara L. Berg, Yejin Choi.
Association for Computational Linguistics. ACL 2012. Jeju, South Korea.
(Oral presentation)

Im2Text: Describing Images Using 1 Million Captioned Photographs. Vicente Ordonez, Girish Kulkarni, Tamara L. Berg. Neural Information Processing Systems. NIPS 2011. Granada, Spain. (Spotlight presentation)

High Level Describable Attributes for Predicting Aesthetics and Interestingness. Sagnik Dhar, Vicente Ordonez, Tamara L. Berg. IEEE Computer Vision and Pattern Recognition. CVPR 2011. Colorado Springs, CO.

The Ariadne Infrastructure for Managing and Storing Metadata. S. Ternier, G. Parra, B. Vandeputte, K. Verbert, J. Klerkx, E. Duval, V. Ordonez, X. Ochoa. Emerging Internet Technologies and Applications for E-learning. IEEE Internet Computing 2009. (Journal paper)

#### PATENTS

Techniques for automatic photo album generation. Google – Android. Vicente Ordonez, Wei Hua, Rodrigo L. Carceroni, Jennifer Gillenwater, Amarnag Subramanya. US Patent No. 8983193. (2015).

Correlating image annotations with foreground features. eBay Inc. Anurag Bhardwaj, Robinson Piramuthu, Vicente Ordonez, Vignesh Jagadeesh, Wei Di. US Patent Application No. 20150067471. (2015).

**M**EDIA COVERAGE / **PRESS** RELEASES

Researchers Combat Gender and Racial Bias in Artificial Intelligence. Bloomberg. 12/04/2017. https://www.bloomberg.com/news/articles/2017-12-04/researchers-combat-gender-and-racial-bias-inartificial-intelligence

Home robots will turn into crude sexists, experts warn. The Times of London. 08/23/2017. https://www.thetimes.co.uk/article/home-robots-will-turn-into-crude-sexists-experts-warn-gnmj09rgq

Machines Taught by Photos Learn a Sexist View of Women. WIRED. 08/21/2017. https://www.wired.com/story/machines-taught-by-photos-learn-a-sexist-view-of-women/

Beyond Silicon: Squeezing More Out of Chips. The New York Times. 10/30/2016. http://www.nytimes.com/2016/10/31/technology/beyond-silicon-squeezing-more-out-of-chips.html

Artificial Intelligence at Your Fingertips. University of Washington CSE News. 10/30/2016. https://news.cs.washington.edu/2016/10/31/uw-cse-and-ai2-in-the-new-york-times-artificialintelligence-at-your-fingertips/

A Powerful Legacy and a Bright Future in the Digital Humanities. UVA Today. 10/13/2016. https://www.news.virginia.edu/content/powerful-legacy-and-bright-future-digital-humanities

### INVITED **TALKS**

Reducing Gender Bias in Machine Learning Systems National Center for Women & IT Summit. Grapevine, TX

May 2018

Speaker: Vision, Language, and Perception Panelist: Bias in Machine Learning Systems Applied Machine Learning Conference. Charlottesville, VA

April 2018

Tom Tom Founders Festival

Keynote Speaker: Scaling Visual Recognition through Language Conference on Integrating Vision and Language Processing. Tartu, Estonia

European Network on Integrating Vision and Language (iV&L Net)

March 2018

Investigación en Reconocimiento Visual Artificial

Universidad Técnica de Machala (UTM), Machala, Ecuador. May 2017 Universidad de Cuenca (UC), Cuenca, Ecuador. May 2017

Vision, Language and Perception.

Digital Humanities Conference at the University of Virginia – DH@UVA

October 2016

Language and Perceptual Categorization in Computer Vision.

Toyota Technological Institute at Chicago TTI-C

April 2015

Hosted by Prof. Greg Shakhnarovich.

Allen Institute for Artificial Intelligence AI2, Seattle, Washington

March 2015

Hosted by Prof. Ali Farhadi.

California Institute of Technology (Caltech), Pasadena, California

March 2015

Hosted by Prof. Pietro Perona.

Carnegie Mellon University, The Robotics Institute VASC Seminar Series February 2015 Hosted by Prof. Abhinav Gupta. Disney Research Pittsburgh, The Walt Disney Company. January 2015 Hosted by Senior Research Scientist Leonid Sigal. Stanford University, Department of Computer Science, Vision Group. December 2014 Hosted by Prof. Fei-fei Li. Integrating Vision and Language. University of Virginia, Computer Science Dept. Charlottesville, Virginia March 2015 March 2015 Virginia Tech, Computer Science Dept., Blacksburg, Virginia Drexel University, Computer Science Dept. Philadelphia, Pennsylvania February 2015 Learning High-level Judgments of Urban Perception. September 2014 ECCV 2014 Workshop on Storytelling with Images and Videos. ETH Zurich ECCV 2014 Workshop on Human-Machine Communication for Visual Recognition. ETH Zurich Understanding Image Descriptions in the Wild. July 2013 Yahoo! Labs, Sunnyvale, California. Hosted by Research Scientist Amit Goyal. Data-driven Generation of Image Descriptions. June 2013 North American Chapter of the Association for Computational Linguistics (NAACL) Workshop on Vision and Language (WVL) 2013. Atlanta, GA Shanmin Pang, Visiting Scholar – Asst. Prof. at Xi'an Jiaotong University Fall 2017 - present Tianlu Wang, PhD Student Fall 2016 - present Fall 2016 - present Xuwang Yin, PhD Student Ziyan Yang, PhD Student (as rotation advisor) Fall 2017 - present Fuwen Tan, PhD Student (as temporary advisor) Fall 2017 - present Fengyang Zhang, MSc Student Spring 2018 - present Abhimanyu Banerjee, MSc Student Spring 2017 - present Anudeep Konda, MSc Student Fall 2017 - present KS Sivaraman, MSc Student Spring 2017 - Fall 2017 Vijay Edupuganti, Undergrad Student Capstone Project Fall 2017 - present Arun Kannan, Undergrad Student Capstone Project Fall 2017 - present Summer 2017 - Fall 2017 Shijia Wang, Undergrad Student Nova Zhang, Undergrad Student Spring 2017 Fall 2016 Divya Bhaskhara, Undergrad Student Capstone Project Rosangel Garcia, CRA-DREU Visting Student – Le Moyne College Summer 2017 Ian K. Torres, CRA-DREU Visting Student – UMass Amherst Summer 2017 Instructor. Introduction to Computer Vision. University of Virginia. Spring 2018 Course website: http://vicenteordonez.com/vision Undergraduate Class: 78 students.

RESEARCH GROUP

TEACHING EXPERIENCE

BA/BSc Students majoring in CS/Comp. Eng./Applied Math/Statistics and others.

Tools Used: Python, Numpy, Pytorch, Google Colaboratory.

Computational Visual Recognition. University of Virginia.

Fall 2017

Course website: http://www.cs.virginia.edu/~vicente/recognition

Graduate Class: 78 students

13 PhD (6 CS + 3 CivilEng + 2 ECE + 1 SysEng + 1 Physics), 31 CS MS, 13 ECE MS, 5 SysEng MS, 3 Data Science MS, 1 Mech&Aerospace ME, 1 MS Chem, 1 MS BioMed, 9 BA/BSc

Tools Used: Python, Pytorch, Jupyter.

Course Rating: 4.49/5.0 (Mean is 4.35 for 6000-level engineering classes)

#### Vision and Language. University of Virginia

Spring 2017

Course website: http://www.cs.virginia.edu/~vicente/vislang

Advanced Graduate Class: 32 students

7 CS PhD, 9 CS MS, 3 SysEng MS, 11 Data Science MS, 2 CS BSc

Tools Used: Python, Keras, Tensorflow, Pytorch.

Course Rating: 4.63/5.0 (Mean is 4.37 for 6000-level engineering classes)

# Computational Visual Recognition. University of Virginia.

Fall 2016

Course website: http://www.cs.virginia.edu/~vicente/recognition/2016

Graduate Class: 36 students

6 PhD (4 CS + 1 BioMed + 1 Stats), 16 CS MS, 4 MEng, 4 Data Science MS, 6 CS BSc

Tools Used: Lua, Torch, Python, Keras, Tensorflow.

Course Rating: 4.62/5.0 (Mean is 4.36 for 6000-level engineering classes)

#### Teaching Assistant.

Foundations of Computer Science. Stony Brook University.	2009-2010
Object Oriented Programming. Escuela Superior Politécnica del Litoral, Ecuador.	2005
Introduction to Programming. Escuela Superior Politécnica del Litoral, Ecuador.	2004
Physics for Engineering. Escuela Superior Politécnica del Litoral, Ecuador.	2004

#### Guest Lectures.

Introduction to Computer Vision. University of Virginia	February 2017
Language and Vision. University of North Carolina at Chapel Hill.	February 2015
Computer Vision. University of North Carolina at Chapel Hill.	November 2014
Artificial Intelligence. University of North Carolina at Chapel Hill.	January 2014
Advanced Multimedia. Stony Brook University.	April 2013
Computational Photography. Stony Brook University.	March 2013

# OTHER ACTIVITIES

#### Lead Organizing Committee.

CVPR Workshop on Large Scale Visual Recognition and Retrieval *BigVision* 2016 University of Virginia's Human and Machine Intelligence Seminar (with Prof. Paul Humphreys) University of Virginia's Computer Vision Seminar (with my PhD students) Stony Brook University Computer Science Graduate Research Conference 2010

## Area Chair.

Vision, Robotics, and Other Grounding. Annual Conference of the North American Chapter of the Association for Computational Linguistics (NAACL) 2018.

#### *Program Committee.*

NAACL Workshop on New Forms of Generalization in Deep Learning 2018 ICCV Workshop on Closing the Loop Between Vision and Language 2015, 2017

ICCV Workshop on Web-scale Vision and Social Media 2015, 2017

NIPS Workshop on Efficient Methods for Deep Neural Networks 2016

ECCV Workshop on Web-scale Vision and Social Media 2016

EMNLP Workshop on Vision and Language 2015

ECCV Workshop on Storytelling with Images and Videos - VisStory 2014

ECCV Workshop on Human-Machine Communication for Visual Recognition 2014

Member of Expert Review Panel.

US National Science Foundation, 2018

FWO - Flanders Research Foundation, Belgium, 2017

#### Reviewer.

Intl. Conference on Computer Vision and Pattern Recognition (CVPR) 2015 - 2018

European Conference on Computer Vision (ECCV) 2016, 2018

International Conference on Computer Vision (ICCV) 2015, 2017

Association for Computational Linguistics (ACL) 2014, 2016, 2017

Empirical Methods in Natural Language Processing (EMNLP) 2015, 2017

IEEE Transactions on Pattern Analysis and Machine Intelligence (TPAMI) 2014 - 2018

International Joint Conference in Artificial Intelligence (IJCAI) 2016

International Journal of Computer Vision (IJCV) 2014 - 2016

Neural Information Processing Systems (NIPS) 2016

Asian Conference on Computer Vision (ACCV) 2016

Int'l Conference on Computer Graphics and Interactive Techniques (SIGGRAPH) 2016

North American Chapter of the Association for Computational Linguistics (NAACL) 2016

IEEE Transactions on Multimedia (TM) 2013, 2016.

Elsevier Computer Vision and Image Understanding (CVIU) 2014, 2015

Elsevier Information Processing Letters (IPL) 2014

IEEE Transactions on Neural Networks and Learning Systems (TNNLS) 2014

IEEE Transactions on Image Processing (TIP) 2013.

ACM Multimedia (MM) 2010. International Multimedia Conference.