



Xiaofeng Ren

Amazon Go

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We have launched!!! I am a senior principal scientist at Amazon. Since 2013, I have been the lead scientist at Amazon Go, using computer vision and machine learning to re-invent retail. We have launched our first "Just-Walk-Out" store that automatically figures out purchases without customer effort, completely eliminating check-out (that "unnecessary" and annoying wait). ([CV](#), [Google Scholar](#)).

I am interested in all aspects of computer vision, as I believe all are needed to solve it. Prior to Amazon, I worked on using [RGB-D](#) (color+depth, a.k.a. Kinect style) cameras, ranging from [3D mapping and modeling](#) to [everyday object recognition](#). I worked on many other vision problems, including [image descriptors](#), [boundary detection](#), [image segmentation](#), [figure-ground grouping](#), [object](#) and [pose recognition](#), [human body detection](#) and [pose estimation](#), [object segmentation](#) and [tracking](#), and [optical flow](#). I had opportunities to work on vision-related problems in [robotics](#) and [human-computer interaction](#).

I was a research scientist at Intel Labs during 2008-2013, working closely with faculty and students at University of Washington. Prior to [sunny Seattle](#), I was a research assistant professor at the Toyota Technological Institute at Chicago ([TTI-C](#)). I received my Ph.D. from U.C. Berkeley in 2006, under the supervision of [Jitendra Malik](#).

(Old) Updates

- **Code available:** here is a preliminary version of the [training code for our NIPS2012 paper on sparse code based contour detection](#).
- **Code available:** learned [sparse coding features for object detection](#) (CVPR13), replacing HOG (30%=>34% on PASCAL 2007).
- **Code available:** I have released a version of [contour detection algorithm using sparse code gradients \(NIPS2012\)](#), with experimental setups for both BSDS500 (color only) and NYU Depth v2 (RGB-D). Enjoy!!
- **Code available:** I have released a version of [our scene labeling algorithms using kernel descriptors \(CVPR12\)](#), with experimental setups for both Stanford Background (outdoor, color only) and NYU Depth (indoor, RGB-D) datasets.
- **Code available:** I have put together C++ implementations of both our kernel descriptor features (NIPS10) and the more recent hierarchical sparse coding features (NIPS11) in a live webcam demo, [here released under BSD license](#). What's more, the demo is now running on [an Android phone!!](#)
- Our book on Consumer Depth cameras (built on [the CDC4CCV workshop at ICCV 2011](#)) is now [published by Springer](#).
- Progress on contour detection: move beyond Pb and use sparse codes to compute local oriented gradients. $F=0.74$ (up from 0.71 of gPb) on [BSDS500](#), a large step forward (human=0.80). Great RGB-D results: $F=0.62$ (vs gPb 0.53) on [NYU Depth \(v2\)](#).
- Check out the [demo video](#) for our Ubicomp paper on fine-grained kitchen activity recognition and tracking. News article at [New Scientist](#).
- Co-organized the third installment of the [3rd RGB-D workshop at RSS](#). All papers are online.
- A C++ implementation of our kernel descriptor features (NIPS10, IROS11), ~5 times faster than the matlab version, and with a live demo using webcams. Please [try this out](#) and let me know your comments and suggestions.
- Upcoming papers at ISER, Ubicomp and the Robotics and Automation Magazine (RAM).
- [Second Workshop on Consumer Depth Cameras for Computer Vision](#), at ECCV 2012.
- Co-organizing [the Second Workshop on Egocentric Vision](#) at this CVPR. We welcome both full papers (Apr 17) and extended abstracts (Apr 24). Please consider [submitting your work in progress!](#)
- CVPR paper accepted on scene labeling on both RGB-D (indoor) and image-only (outdoor) scenes. Preprint available.
- Liefeng's [NIPS paper](#) on hierarchical orthogonal matching pursuit for learning image features.
- The (Matlab) code for kernel descriptors is now available. Please [try it out!!](#)
- Check out our ubicomp final video on interactive mapping on [youtube](#).
- Co-organized the [2nd RGB-D workshop at RSS](#) on advanced perception using depth cameras; it's a great success!! 18 presentations, 7 demos and over 70 attendees. All the papers, videos, slides will be [available online](#).
- Two BMVC papers to appear on material recognition and video segmentation.
- Two IROS papers to appear on depth kernel descriptors and object discovery based on scene changes.
- Our interactive mapping work (online user interaction in real-time mapping) to appear at Ubicomp 2011.
- Our [sparse distance learning](#) paper won the [best vision paper](#) award at ICRA!!
- Co-organizing the [2nd RGB-D workshop at RSS](#) on advanced perception using depth cameras, and the [ICCV Workshop on Consumer Depth Cameras](#).
- Our RGB-D dataset (ICRA 2011) is now [available online](#) covering 300 everyday objects. Send us comments!
- Two papers to appear at CVPR 2011 on kernel descriptors and egocentric video.
- Three papers accepted at ICRA 2011 on object recognition and discovery. Congratulations Kevin and Evan.
- [OASIS / Interactive LEGO demo at CES](#), robust RGB-D recognition using kernel descriptors.
- [HeatWave](#) paper as [honorable mention](#) at CHI, congratulations Eric, Gabe and Sidhant!!
- [Kernel Descriptor paper](#) at NIPS 2010, framework for local features beyond SIFT with strong recognition results.
- [Colloquium talk](#) at the UW CSE Department on [RGB-D Perception](#) beyond gestures.
- New [RGBDvision channel](#) on youtube (~300,000 clicks already).
- Affiliate assistant professor appointment at the [CSE Department](#), University of Washington.
- Co-organized the [RGB-D Perception workshop at RSS 2010](#) (all slides online).
- Co-organized the [Egocentric vision workshop at CVPR 2009](#) (presented the Intel [egocentric object dataset](#)).

Publications

- **Depth Enhancement via Low-rank Matrix Completion.** [\[pdf\]](#) [\[project\]](#)
Si Lu, Xiaofeng Ren, Feng Liu, in CVPR 2014.
Ever unhappy with poor-quality depth data? Si and Feng has a solution!
- **Change Their Perception: RGB-D for 3-D Modeling and Recognition.** [\[read online\]](#)
Xiaofeng Ren, Dieter Fox, and Kurt Konolige, in IEEE Robotics and Automation Magazine (RAM), 2013.
Summary of our RGB-D work on 3D modeling and recognition for a broad audience
- **Histograms of Sparse Codes for Object Detection.** [\[abstract\]](#) [\[pdf\]](#) [\[code\]](#)
Xiaofeng Ren and Deva Ramanan, at CVPR 2013.
Move beyond HOG! Use learned sparse code dictionaries to significantly improve object detection accuracy
- **Multipath Sparse Coding Using Hierarchical Matching Pursuit.** [\[abstract\]](#) [\[pdf\]](#) [\[code\]](#)
Liefeng Bo, Xiaofeng Ren and Dieter Fox, at CVPR 2013.
Extend hierarchical matching pursuit (NIPS11) to a reconfigurable architecture that captures structures of varying scale and deformation
- **RGB-D Flow: Dense 3-D Motion Estimation Using Color and Depth.** [\[abstract\]](#) [\[pdf\]](#) [\[code\]](#)
Evan Herbst, Xiaofeng Ren and Dieter Fox, at IROS 2013.
General motion estimation using Kinect; extend variational optical flow to RGB-D data
- **Discriminatively Trained Sparse Code Gradients for Contour Detection.** [\[abstract\]](#) [\[pdf\]](#) [\[test code\]](#) [\[training code\]](#)
Xiaofeng Ren and Liefeng Bo, at NIPS 2012.
Pushing the limit of local features for contour detection; a large step forward (0.71=>0.74 on BSDS500, human=0.8)
- **SensorSift: Balancing Sensor Data Privacy and Utility in Automated Face Understanding.** [\[abstract\]](#) [\[pdf\]](#)
Miro Enev, Jaeyeon Jung, Liefeng Bo, Xiaofeng Ren and Tadayoshi Khono, at the Annual Computer Security Applications Conference (ACSAC), 2012.
- **Ontology Guided Approach to Retrieving Disease Manifestation Images for Health Image Base Construction.** (best paper) [\[abstract\]](#)
Yang Chen, Xiaofeng Ren, Guo-Qiang Zhang, Rong Xu, at Annual IEEE Healthcare Informatics, Imaging, and Systems Biology Conference (HISB), 2012.
- **Fine-Grained Kitchen Activity Recognition using RGB-D.** [\[abstract\]](#) [\[pdf\]](#) [\[video\(wmv\)\]](#) [\[news\]](#)
Jinna Lei, Xiaofeng Ren, and Dieter Fox, at Ubicomp 2012.
Prototype system for tracking objects and recognizing actions and activities for smart kitchen applications
- **Unsupervised Feature Learning for RGB-D Based Object Recognition.** [\[abstract\]](#) [\[pdf\]](#) [\[C++ code\]](#)
Liefeng Bo, Xiaofeng Ren, and Dieter Fox, at ISER 2012.
Extending our fast feature learning using hierarchical matching pursuit (NIPS '11) to RGB-D data
- **RGB-(D) Scene Labeling: Features and Algorithms.** [\[abstract\]](#) [\[pdf\]](#) [\[code\]](#)
Xiaofeng Ren, Liefeng Bo, and Dieter Fox, at CVPR 2012.
RGB (and D) scene labeling, 76% on NYU Depth (up from 56%) and 83% on Stanford Background (from 79%)
- **Detection-based Object Labeling in 3D Scenes.** [\[abstract\]](#) [\[pdf\]](#) [\[video\]](#)
Kevin Lai, Liefeng Bo, Xiaofeng Ren and Dieter Fox, at ICRA 2012.
Detecting 3D objects in RGB-D frames and segmenting them in merged 3D point clouds (using RGB-D dataset)
- **RGB-D Mapping: Using Depth Cameras for Dense 3D Modeling of Indoor Environments .** [\[abstract\]](#) [\[pdf\]](#)
Peter Henry, Michael Krainin, Evan Herbst, Xiaofeng Ren and Dieter Fox, at International Journal of Robotics Research (IJRR), 2012.
Journal version of our RGB-D mapping system (ISER), with extended algorithm comparisons and results
- **Hierarchical Matching Pursuit for Image Classification: Architecture and Fast Algorithms.** [\[abstract\]](#) [\[pdf\]](#) [\[C++ code\]](#) [\[Android code\]](#)
Liefeng Bo, Xiaofeng Ren and Dieter Fox, at NIPS 2011.
Learning patch features using matching pursuit (sparse coding), 2 orders of magnitude faster than prior work
- **Toward Robust Material Recognition for Everyday Objects.** [\[abstract\]](#) [\[pdf\]](#)
Diane Hu, Liefeng Bo, Xiaofeng Ren, at BMVC 2011.
Real-world material recognition, 54% on MIT Flickr Dataset (up from 45%)
- **Combining Self Training and Active Learning for Video Segmentation.** [\[pdf\]](#)
Alireza Fathi, Maria Florina Balcan, Xiaofeng Ren and Jim Rehg, at BMVC 2011.
Simple but effective semi-supervised learning for segmenting out objects in video
- **Depth Kernel Descriptors for Object Recognition.** [\[pdf\]](#) [\[C++ code\]](#) [\[matlab code\]](#)
Liefeng Bo, Xiaofeng Ren and Dieter Fox, at IROS 2011.
Designing kernel descriptors for recognition in depth images, 53%=>79% on RGB-D benchmark
- **RGB-D Object Discovery via Multi-Scene Analysis.** [\[pdf\]](#)
Evan Herbst, Xiaofeng Ren and Dieter Fox, at IROS 2011.
Enable a robot to automatically discover and cluster objects via multiple visits to a scene; works on all objects
- **Interactive 3D Modeling of Indoor Environments with a Consumer Depth Camera.** [\[abstract\]](#) [\[pdf\]](#) [\[video\]](#)
Hao Du, Peter Henry, Xiaofeng Ren, Marvin Cheng, Dan Goldman, Steve Seitz, Dieter Fox, at Ubicomp 2011.
First interactive system for RGB-D mapping, runs near real-time and allows user feedback and control on-the-spot
- **HeatWave: Thermal Imaging for Surface User Interaction.** (honorable mention) [\[abstract\]](#) [\[pdf\]](#)
Eric Larson, Gabe Cohn, Sidhant Gupta, Xiaofeng Ren, Beverly Harrison, Dieter Fox, Shwetank N. Patel at CHI 2011.
All the cool things you can do with a heat camera! I wish they are mass produced...

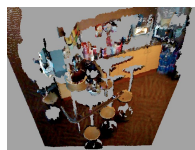
- **A Scalable Tree-based Approach for Joint Object and Pose Recognition.** [\[abstract\]](#) [\[pdf\]](#)
Kevin Lai, Liefeng Bo, Xiaofeng Ren and Dieter Fox, at AAAI 2011.
Joint tree model for category, instance and pose recognition; sequential decision.
- **Object Recognition with Hierarchical Kernel Descriptors.** [\[abstract\]](#) [\[pdf\]](#)
Liefeng Bo, Kevin Lai, Xiaofeng Ren and Dieter Fox, at CVPR 2011.
Use the kernel descriptor framework (NIPS10) to both pixel->patch and patch->image
- **Learning to Recognize Objects in Egocentric Activities.** [\[abstract\]](#) [\[pdf\]](#)
Alireza Fathi, Xiaofeng Ren and Jim Rehg, at CVPR 2011.
Focus on object-in-hand in egocentric video; clustering and discovery of objects in activities
- **A Large-Scale Hierarchical Multi-View RGB-D Object Dataset.** [\[abstract\]](#) [\[pdf\]](#) [\[dataset\]](#)
Kevin Lai, Liefeng Bo, Xiaofeng Ren and Dieter Fox, at ICRA 2011.
RGB-D object recognition benchmark: 51 categories, 300 objects, 250K total views
- **Sparse Distance Learning for Object Recognition Combining RGB and Depth Information.** (best vision paper) [\[abstract\]](#) [\[pdf\]](#)
Kevin Lai, Liefeng Bo, Xiaofeng Ren and Dieter Fox, at ICRA 2011.
Local distance learning and feature selection using instance-to-class distance
- **Toward Object Discovery and Modeling via 3-D Scene Comparison.** [\[abstract\]](#) [\[pdf\]](#)
Evan Herbst, Xiaofeng Ren and Dieter Fox, at ICRA 2011.
How can a robot discover objects robustly? By visiting a scene and finding out the changes
- **Kernel Descriptors for Visual Recognition.** [\[abstract\]](#) [\[pdf\]](#) [\[C++ code\]](#) [\[matlab code and more info\]](#)
Liefeng Bo, Xiaofeng Ren and Dieter Fox, at NIPS 2010.
Flexible way to derive local descriptors; significantly outperform SIFT on many benchmarks
- **RGB-D Mapping: Using Depth Cameras for Dense 3D Modeling of Indoor Environments .** [\[abstract\]](#) [\[pdf\]](#) [\[news\]](#)
Peter Henry, Michael Krainin, Evan Herbst, Xiaofeng Ren and Dieter Fox, at ISER 2010.
Our first RGB-D paper, 3D modeling of large indoor environments with RGB-D cameras
- **Discriminative Mixture-of-Templates for Viewpoint Classification.** [\[abstract\]](#) [\[pdf\]](#)
Chunhui Gu and Xiaofeng Ren, at ECCV 2010, Crete, Greece, 2010.
First paper on discriminative models for viewpoint/pose recognition, large improvement: 57%=>74% on 3DObject
- **Manipulator and Object Tracking for In-Hand 3D Object Modeling.** [\[pdf\]](#)
Michael Krainin, Peter Henry, Xiaofeng Ren and Dieter Fox, in International Journal of Robotics Research (IJRR), 2011.
Enable a robot to automatically study objects and build 3D models through manipulation
- **Manipulator and Object Tracking for In Hand Model Acquisition.** [\[pdf\]](#)
Michael Krainin, Peter Henry, Xiaofeng Ren and Dieter Fox, at the Mobile Manipulation and Best Practices in Robotics Workshops at ICRA 2010.
- **Figure-Ground Segmentation Improves Handled Object Recognition in Egocentric Video.** [\[abstract\]](#) [\[pdf\]](#) [\[video\]](#) [\[dataset\]](#)
Xiaofeng Ren and Chunhui Gu, at CVPR 2010, San Francisco, 2010.
Egocentric recognition can work!! ~90% accuracy on a very challenging dataset for objects-in-hand. Check out the videos.
- **Egocentric Recognition of Handled Objects: Benchmark and Analysis.** [\[abstract\]](#) [\[pdf\]](#) [\[dataset\]](#)
Xiaofeng Ren and Matthai Philipose, in *Egovision Workshop '09*, Miami, 2009.
Can we recognize objects in a user's hand? A large benchmark (43 objects, 2 hours of video) using a wearable camera
- **Multi-Scale Improves Boundary Detection in Natural Images.** [\[abstract\]](#) [\[pdf\]](#)
Xiaofeng Ren, in *ECCV '08*, Marseille, 2008.
Multi-scale does help contour detection on natural images - extensive benchmarking and analysis
- **Finding People in Archive Films through Tracking.** [\[abstract\]](#) [\[pdf\]](#) [\[video\]](#)
Xiaofeng Ren, in *CVPR '08*, Anchorage, 2008.
- **Local Grouping for Optical Flow.** [\[abstract\]](#) [\[pdf\]](#)
Xiaofeng Ren, in *CVPR '08*, Anchorage, 2008.
- **Tracking as Repeated Figure/Ground Segmentation.** [\[abstract\]](#) [\[pdf\]](#) [\[ps\]](#) [\[bibtex\]](#) [\[video\]](#)
Xiaofeng Ren and Jitendra Malik, in *CVPR '07*, Minneapolis 2007.
- **Learning and Matching Line Aspects for Articulated Objects.** [\[abstract\]](#) [\[pdf\]](#) [\[ps\]](#) [\[bibtex\]](#)
Xiaofeng Ren, in *CVPR '07*, Minneapolis 2007.
- **Figure/Ground Assignment in Natural Images.** [\[abstract\]](#) [\[pdf\]](#) [\[ps\]](#) [\[bibtex\]](#)
Xiaofeng Ren, Charless Fowlkes and Jitendra Malik, in *ECCV '06*, volume 2, pages 614-627, Graz 2006.
- **Learning Probabilistic Models for Contour Completion in Natural Images.** [\[abstract\]](#) [\[pdf\]](#)
Xiaofeng Ren, Charless Fowlkes and Jitendra Malik, in *IJCV Special Issue on Machine Learning for Vision*, May 2008.
- **Cue Integration in Figure/Ground Labeling.** [\[abstract\]](#) [\[pdf\]](#) [\[bibtex\]](#)
Xiaofeng Ren, Charless Fowlkes and Jitendra Malik, in *NIPS '05*, Vancouver 2005.
- **Recovering Human Body Configurations using Pairwise Constraints between Parts.** [\[abstract\]](#) [\[pdf\]](#) [\[bibtex\]](#)
Xiaofeng Ren, Alex Berg and Jitendra Malik, in *ICCV '05*, volume 1, pages 824-831, Beijing 2005.
- **Scale-Invariant Contour Completion using Conditional Random Fields.** [\[abstract\]](#) [\[pdf\]](#) [\[ps\]](#) [\[bibtex\]](#)
Xiaofeng Ren, Charless Fowlkes and Jitendra Malik, in *ICCV '05*, volume 2, pages 1214-1221, Beijing 2005.

- **Familiar Configuration Enables Figure/Ground Assignment in Natural Scenes.** [\[abstract\]](#) [\[poster\]](#) [\[bibtex\]](#)
Xiaofeng Ren, Charless Fowlkes and Jitendra Malik, in *VSS 05*, Sarasota, FL 2005.
- **Mid-level Cues Improve Boundary Detection.** [\[abstract\]](#) [\[pdf\]](#) [\[ps\]](#) [\[bibtex\]](#)
Xiaofeng Ren, Charless Fowlkes and Jitendra Malik, Berkeley Technical Report 05-1382, CSD 2005.
- **Recovering Human Body Configurations: Combining Segmentation and Recognition.** [\[abstract\]](#) [\[pdf\]](#) [\[ps\]](#) [\[bibtex\]](#)
Greg Mori, Xiaofeng Ren, Alyosha Efros and Jitendra Malik, in *CVPR '04*, volume 2, pages 326-333, Washington, DC 2004.
- **Learning a Classification Model for Segmentation.** [\[abstract\]](#) [\[pdf\]](#) [\[ps\]](#) [\[bibtex\]](#)
Xiaofeng Ren and Jitendra Malik, in *ICCV '03*, volume 1, pages 10-17, Nice 2003.
- **The Ecological Statistics of Good Continuation: Multi-scale Markov Models for Contours.** [\[abstract\]](#) [\[talk\]](#) [\[bibtex\]](#)
Xiaofeng Ren and Jitendra Malik, in *VSS 02*, Sarasota, FL 2002.
- **A Probabilistic Multi-scale Model for Contour Completion Based on Image Statistics.** [\[abstract\]](#) [\[pdf\]](#) [\[ps\]](#) [\[bibtex\]](#)
Xiaofeng Ren and Jitendra Malik, in *ECCV '02*, volume 1, pages 312-327, Copenhagen 2002.

(Old) Research Projects



Discriminative Viewpoint
Classification



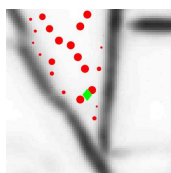
RGB-D Mapping



Egocentric Object Recognition



Multi-Scale Improves
Boundary Detection



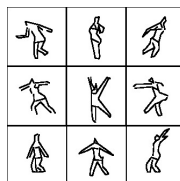
Local Grouping for Optical Flow



Finding and Tracking People in
Archive Films



Tracking as Repeated
Figure/Ground Segmentation



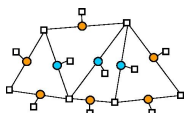
Line-based Aspect Learning and
Matching



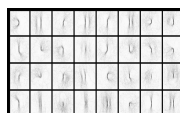
Figure-ground organization in
natural images



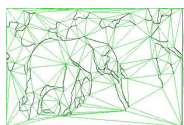
Cue Integration in
Figure/Ground Labeling



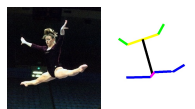
Scale-Invariant Contour
Completion using Conditional
Random Fields



Using Shapemes for Mid-level
Vision



A Scale-Invariant Image
Representation: the CDT Graph



Pairwise Constraints between
Human Body Parts



Learning Discriminative Models
for Image Segmentation



Human Body Configuration
from Bottom-Up: a
Segmentation-based Approach

Contours in Natural Images and
Scale Invariance

Superpixel: Empirical Studies
and Applications

