

# Baifeng Shi

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## EDUCATION BACKGROUND

<b>University of California, Berkeley</b> <i>Ph.D., Computer Science</i> <ul style="list-style-type: none"><li>Advisor: Trevor Darrell</li><li>Awards and Honors:<ul style="list-style-type: none"><li>BAIR Ignition Reward, UC Berkeley</li></ul></li></ul>	09/2021 – 06/2026 (expected)
<b>Peking University</b> <i>B.S., Computer Science</i> <ul style="list-style-type: none"><li>Advisor: Yadong Mu</li><li>Overall GPA: 3.75 / 4</li><li>Awards and Honors:<ul style="list-style-type: none"><li>Gold Medal (3 / 360), Chinese Physics Olympiad final contest</li><li>EECS Dean Scholarship, Peking University</li><li>Merit Student, Peking University</li></ul></li></ul>	09/2017 - 06/2021  10/2016 09/2017 09/2018 & 09/2020

## RESEARCH APPOINTMENTS

<b>University of California, Berkeley</b> , Research Assistant <i>Advisor: Prof. Trevor Darrell</i>	09/2021 - now
<b>University of California, Berkeley</b> , Research Intern <i>Advisor: Dr. Huijuan Xu &amp; Prof. Trevor Darrell</i>	03/2020 - 11/2020
<b>Microsoft Research Asia</b> , Research Intern <i>Advisor: Dr. Qi Dai &amp; Dr. Jingdong Wang</i>	09/2019 - 03/2021
<b>Peking University</b> , Research Intern <i>Advisor: Prof. Yadong Mu</i>	09/2018 - 09/2019

## PUBLICATIONS

- Baifeng Shi**, Yale Song, Neel Joshi, Trevor Darrell, Xin Wang, *Visual Attention Emerges from Recurrent Sparse Reconstruction*, **ICML 2022**
- Baifeng Shi**, Qi Dai, Judy Hoffman, Kate Saenko, Trevor Darrell, Huijuan Xu, *Temporal Action Detection with Multi-level Supervision*, **ICCV 2021**
- Baifeng Shi**, Judy Hoffman, Kate Saenko, Trevor Darrell, Huijuan Xu, *Auxiliary Task Reweighting for Minimum-data Learning*, **NeurIPS 2020**
- Zhekun Luo, Devin Guillory, **Baifeng Shi**, Wei Ke, Fang Wan, Trevor Darrell, Huijuan Xu, *Weakly-Supervised Action Localization with Expectation-Maximization Multi-Instance Learning*, **ECCV 2020**
- Baifeng Shi**<sup>\*</sup>, Dinghuai Zhang<sup>\*</sup>, Qi Dai, Zhanxing Zhu, Yadong Mu, Jingdong Wang, *Informative Dropout for Robust Representation Learning: A Shape-bias Perspective*, **ICML 2020**
- Baifeng Shi**, Qi Dai, Jingdong Wang, Yadong Mu, *Weakly-Supervised Action Localization by Generative Attention Modeling*, **CVPR 2020**

## RESEARCH EXPERIENCE

<i>Ongoing Work, advised by Dr. Xin Wang and Prof. Trevor Darrell</i>	<i>UC Berkeley</i>
<b>Top-down Visual Attention</b>	03/2022 – now
<ul style="list-style-type: none"><li>Current Self-Attention will highlight all the objects in an image and mix the representations of all objects together. In contrast, human has learned to only attend to the objects that are related to the current task.</li><li>Proposed top-down attention, which uses a high-level task-related prompt to modulate the attention in intermediate layers.</li><li>Showed that by formulating the visual recognition process as Bayesian Inference (Analysis by Synthesis), feedback connections will naturally emerge, which carry top-down signals to direct the bottom-up attention to the specific objects.</li><li>Used a variational approximation to the Bayesian Inference to keep the computational efficiency.</li><li>Observed a similar behavior to human cognition on bistable images and visual hysteresis, where the model is able to attend to different features and recognize different objects when the prior is different.</li><li>Applied in various real-world scenarios, such as visual-language tasks of VQA and zero-shot recognition where a language prompt guides the attention.</li></ul>	

*Independent research, advised by Dr. Xin Wang and Prof. Trevor Darrell*

*UC Berkeley*

### **Visual Attention Emerges from Recurrent Sparse Reconstruction**

08/2021 – 02/2022

- Proposed a formulation of visual attention by taking inspiration from how human visual attention works, especially focusing on two key ingredients in human visual attention, recurrent connection and sparse representation
- Showed that adding recurrent connections into feedforward network is equivalent to adding sparse reconstruction blocks.
- Showed that attention can naturally emerge from sparse reconstruction, where recurrent connections group features into separate objects and the sparsity constraint selects the most salient objects.
- Pointed out that self-attention is a special case of our attention formulation, providing a new perspective on how self-attention works.
- Observed higher robustness and more consistency with human eye fixation map.
- The work is summarized in a paper and accepted to ICML 2022.

*Independent research, advised by Dr. Huijuan Xu and Prof. Trevor Darrell*

*UC Berkeley*

### **Unsupervised Foreground Mining for Omni-supervised Action Localization**

06/2020 – 11/2020

- Built the first baselines for semi-supervised and omni-supervised action localization.
- Designed error analysis to find the main sources of error in the baseline models.
- Proposed to solve the action incompleteness problem in the semi-supervised baseline by learning object-centric representations. Built a structural causal model of the foreground/background action in neighboring frames, and proposed to detect foreground objects by minimizing the conditional mutual information between foreground and background motion.
- Proposed to solve the action-context confusion problem in the omni-supervised baseline by designing an information bottleneck to discard scene information while preserve action information.
- The work is summarized in a paper and accepted to ICCV 2021.

*Independent research, advised by Dr. Huijuan Xu and Prof. Trevor Darrell*

*UC Berkeley*

### **Auxiliary Task Reweighting for Minimum-data Learning**

03/2020 – 06/2020

- Addressed the problem of automatically reweighting multiple auxiliary tasks to learn the main task with minimum information (supervision).
- Exploited the key insight that *information required for inference can be reduced by a good prior*, and formulated the problem as optimizing the KL divergence between the true prior and the surrogate prior given by the weighted likelihood of auxiliary tasks.
- Utilized tools and concepts including Fisher score and Langevin dynamics, and further simplified the optimization of the KL divergence into minimizing the l2 distance between main/auxiliary task gradients, which gives a light-weight algorithm to reweight auxiliary tasks on-the-fly.
- Derived theoretical guarantees that our algorithm finds the optimal task weights up to a small error.
- Experimentally observed that our algorithm finds the optimal task weights and minimizes the data requirement under various settings, *e.g.*, semi-supervised learning, domain generalization, and multi-label classification.
- The work is summarized in a paper and accepted to NeurIPS 2020.

*Independent research, mentored by Dr. Qi Dai, Dr. Jingdong Wang, and Prof. Yadong Mu*

*Microsoft Research Asia*

### **Human Vision Inspired Shape-bias for Model Robustness**

11/2019 – 02/2020

- Analyzed the relationship between the texture-bias of CNN and its multiple kinds of vulnerability.
- Proposed to discriminate texture from shape by the self-information in an image, resembling the mechanism of saliency detection and eye movement in the human visual system.
- Proposed a Dropout-like algorithm to de-correlate the model output with the texture information in the input, thus enhancing the shape-bias of the model.
- Conducted experiments under different scenarios (domain generalization, few-shot classification, image corruption, and adversarial perturbation) and observed a universal improvement in model robustness.
- The work is summarized in a paper and accepted to ICML 2020.

*Independent research, mentored by Dr. Qi Dai, Dr. Jingdong Wang, and Prof. Yadong Mu*

*Microsoft Research Asia*

### **Weakly Supervised Action Localization**

08/2019 – 11/2019

- Tackled with a common challenge in weakly supervised action localization, namely action-context confusion.
- Built a probabilistic graphical model and formulated the problem as modeling the frame-wise class-agnostic likelihood and optimizing the maximum a posteriori (MAP) estimation.
- Proposed to separate foreground and context by modeling the appearance-level frame likelihood using a generative model, *viz.* conditional variational auto-encoder (CVAE).
- Improved the results on two common datasets by a large margin (10% relative improvement).
- The work is summarized in a paper and accepted to CVPR 2020.

*Independent research, advised by Prof. Yadong Mu*

*Peking University*

**Fast Video Understanding with Reinforcement Learning**

10/2018 – 08/2019

- Proposed an algorithm to use as few frames as possible to classify a video while preserving an expected accuracy.
- Formulated the reward function as the Lagrangian of the constrained optimization problem, and optimized it using reinforcement learning algorithm, viz. soft actor-critic (SAC).
- Boost the original algorithm by 400% while preserving the accuracy.