# CHAOQIN HUANG

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## **EDUCATION**

### SJTU-NUS Joint Ph.D. of Computer Vision

Sept. 2019 – Present

Information and Communication Engineering, Shanghai Jiao Tong University (SJTU), Shanghai, China Electrical & Computer Engineering, National University of Singapore (NUS), Singapore

#### **Bachelor of Computer Science**

Sept. 2015 – July 2019

Computer Science, Shanghai Jiao Tong University (SJTU), Shanghai, China

### **RESEARCH**

- Research Area: Computer Vision, Machine Learning
- Application: Anomaly Detection on Industrial Defect Detection and Medical Diagnosis
- Citations: 460+ (due: Oct 2023), h-index 8

## RESEARCH EXPERIENCES

Learning and Vision Lab, ECE, National University of Singapor	e Singapore
Ph.D. Candidate   Supervised by: Prof. Xinchao Wang	July 2022 - Present
Cooperative Medianet Innovation Center, Shanghai Jiao Tong U	Iniversity Shanghai, China
Ph.D. Candidate   Supervised by: Prof. Ya Zhang	Sept 2019 - Present
Shanghai AI Lab	Shanghai, China
Research Intern   Supervised by: Prof. Ya Zhang April 2021	- July 2022, Aug 2023 - Present
Research Institute, SenseTime	Shanghai, China
Research Intern   Supervised by: Dr. Jianping Shi	March 2018 - April 2019
Machine Vision and Intelligence Group, Shanghai Jiao Tong Un	iversity Shanghai, China
Research Assistant   Supervised by: Prof. Cewu Lu	May 2017 - June 2019

### **C** Honors and Awards

National Scholarship of China	December 2022
Outstanding Graduate of Shanghai Jiao Tong University	June 2019
1st Outstanding Graduation Thesis Award of Computer Science in SJTU	June 2019
SenseTime Scholarship	December 2018
Shanghai Jiao Tong University WISH Scholarship	May 2018
Meritorious Winner of Mathematical Contest In Modeling 2018	April 2018
Shanghai Jiao Tong University Academic Excellent Scholarship	2017 - 2022

# Publication (Journal)

# • Self-Supervised Masking for Unsupervised Anomaly Detection and Localization

Chaoqin Huang, Qinwei Xu, Yanfeng Wang, Yu Wang, Ya Zhang

IEEE Transactions on Multimedia (TMM 2022, SCI District 1 Top)

We proposed a self-supervised learning approach named <u>Self-Supervised Masking</u> (SSM) for unsupervised anomaly detection and localization. SSM enhances the training of the inpainting network and leads to improvement in the efficiency of mask prediction at inference. We proposed a progressive mask refinement approach that progressively uncovers the normal regions and locates the anomalous regions. The proposed method outperforms state-of-the-arts, achieving 98.3% AUC on Retinal-OCT (medical diagnosis) and 93.9% AUC on MVTec AD (industrial defect detection), respectively.

- Attribute Restoration Framework for Anomaly Detection
  Fei Ye\*, Chaoqin Huang\*, Jinkun Cao, Maosen Li, Ya Zhang, Cewu Lu (\* equal contribution)
  IEEE Transactions on Multimedia (TMM 2022, SCI District 1 Top, ESI Highly Cited Paper)
  We proposed to erase selected attributes from the original data and reformulate the anomaly detection task as a restoration task in the self-supervised learning paradigm, where the normal and the anomalous data are expected to be distinguishable based on restoration errors. By forcing the network to restore the original image, the semantic feature embeddings related to the erased attributes are learned by the network. The proposed method significantly outperforms several state-of-the-arts on multiple benchmark datasets, especially on ImageNet, increasing the AUC of the top-performing baseline by 10.1%.
- Self-supervised Tumor Segmentation with Sim2Real Adaptation
  Xiaoman Zhang, Weidi Xie, Chaoqin Huang, Ya Zhang, Xin Chen, Qi Tian, Yanfeng Wang
  IEEE Journal of Biomedical and Health Informatics (JBHI 2023, SCI District 1 Top)
  We proposed a two-stage Sim2Real training regime for unsupervised tumor segmentation, where we first
  pre-train a model with simulated tumors and then adopt a self-training strategy for downstream data adaptation. When evaluating on BraTS2018 for brain tumor segmentation and LiTS2017 for liver tumor segmentation, we achieve state-of-the-art segmentation performance under the unsupervised setting.
- (under review) Few-Shot Anomaly Detection via Category-Agnostic Registration Learning Chaoqin Huang, Haoyan Guan, Aofan Jiang, Yanfeng Wang, Michael Spratling, Xinchao Wang, Ya Zhang IEEE Transactions on Neural Networks and Learning Systems (TNNLS, SCI District 1 Top) Existing anomaly detection methods require a dedicated model for each category. Such a paradigm is computationally expensive and inefficient. This paper proposes the first FSAD method that requires no model fine-tuning for novel categories: enabling a single model to be applied to all categories. It improves the current state-of-the-art for FSAD by 11.3% and 8.3% on the MVTec and MPDD benchmarks, respectively.

# **CONFERENCE** Publication (Conference)

- Adapting Visual-Language Models for Generalizable Anomaly Detection in Medical Images Chaoqin Huang\*, Aofan Jiang\*, Jinghao Feng, Ya Zhang, Xinchao Wang, Yanfeng Wang IEEE/CVF Computer Vision and Pattern Recognition Conference (CVPR 2024)

  This paper introduces a lightweight multi-level adaptation and comparison framework to repurpose the CLIP model for medical anomaly detection. Our approach integrates multiple residual adapters into the pre-trained visual encoder, enabling a stepwise enhancement of visual features across different levels. The adapted features exhibit improved generalization across various medical data types, even in zero-shot scenarios where the model encounters unseen medical modalities and anatomical regions during training.
- Multi-scale Cross-restoration Framework for Electrocardiogram Anomaly Detection
   Aofan Jiang\*, Chaoqin Huang\*, Qing Cao, Shuang Wu, Zi Zeng, Xinchao Wang, Kang Chen, Ya Zhang
   International Conference on Medical Image Computing and Computer-Assisted Intervention (MICCAI
   2023, Early accepted)

Detecting anomalies in Electrocardiogram (ECG) data is particularly challenging due to the substantial inter-individual differences and the presence of anomalies in both global rhythm and local morphology. Imitating the diagnostic process followed by experienced cardiologists, we proposed a novel multi-scale cross-restoration framework for ECG anomaly detection and localization, achieving state-of-the-art performance on our proposed large-scale ECG benchmark and two other well-known ECG datasets.

• Registration based Few-Shot Anomaly Detection
Chaoqin Huang, Haoyan Guan, Aofan Jiang, Ya Zhang, Michael Spratling, Yanfeng Wang
European Conference on Computer Vision (ECCV 2022, oral presentation, Top 2.5%)
We considered few-shot anomaly detection (FSAD), a practical yet under-studied setting for anomaly detection, where only a limited number of normal images are provided for each category at training. Inspired by how humans detect anomalies, *i.e.*, comparing an image in question to normal images, we leveraged registration, an image alignment task that is inherently generalizable across categories, as the proxy task, to train a category-agnostic anomaly detection model. During testing, the anomalies are identified by comparing the registered features of the test image and its corresponding support (normal) images. Experimental results have shown that the proposed method outperforms the state-of-the-art FSAD methods by 3%-8% in AUC on the MVTec and MPDD benchmarks.

• ESAD: End-to-end Deep Semi-supervised Anomaly Detection

Chaoqin Huang, Fei Ye, Peisen Zhao, Ya Zhang, Yanfeng Wang, Qi Tian

The British Machine Vision Conference (BMVC 2021)

We proposed a new KL-divergence-based objective function and show that two factors: the mutual information, and the entropy, constitute an integral objective function for anomaly detection. Extensive experiments have revealed that the proposed method significantly outperforms several state-of-the-arts on multiple benchmark datasets, including medical diagnosis and several classic anomaly detection benchmarks.

#### • Semi-Supervised Domain Generalization for Medical Image Analysis

Ruipeng Zhang, Qinwei Xu, Chaoqin Huang, Ya Zhang, Yanfeng Wang

IEEE International Symposium on Biomedical Imaging (ISBI 2021)

We introduced a general regularization-based semi-supervised domain generalization method, where the stability and orthogonality of the learned features are introduced as two regularization factors of the learning objective. Both regularization factors can be applied to both labeled and unlabelled data.

# • Deep Unsupervised Image Anomaly Detection: An Information Theoretic Framework

Fei Ye, Huangjie Zheng, Chaoqin Huang, Ya Zhang

IEEE International Conference on Image Processing (ICIP 2021)

We proposed an objective function for anomaly detection with information theory, which maximizes the distance between normal and anomalous data in terms of the joint distribution of images and their representation. We managed to find its lower bound which weights the trade-off between mutual information and entropy, which leads to a novel information theoretic framework for unsupervised image anomaly detection.

### • DrivingStereo: A Large Dataset to Make Sense of Stereo Matching for Auto-Driving

Guorun Yang, Xiao Song, Chaoqin Huang, Zhidong Deng, Jianping Shi, Bolei Zhou

IEEE/CVF Computer Vision and Pattern Recognition Conference (CVPR 2019)

We constructed a novel large-scale stereo dataset named DrivingStereo. It contains over 100k images covering a diverse set of driving scenarios. High-quality labels of disparity are produced by a model-guided filtering strategy from multi-frame LiDAR points.

#### • Recurrent Residual Module for Fast Inference in Videos

Bowen Pan, Wuwei Lin, Xiaolin Fang, Chaoqin Huang, Bolei Zhou, Cewu Lu

IEEE/CVF Computer Vision and Pattern Recognition Conference (CVPR 2018)

We proposed a framework called Recurrent Residual Module (RRM) to accelerate the CNN inference for video recognition tasks. This framework has a novel design of using the similarity of the intermediate feature maps of two consecutive frames, to largely reduce the redundant computation.

### SERVICES

- Journal Reviewer: IEEE transactions on image processing (TIP), IEEE Transactions on Multimedia (TMM), IEEE transactions on neural networks and learning systems (TNNLS), IEEE Transactions on Medical Imaging (TMI), Expert systems with applications, Information fusion
- Conference Reviewer: CVPR, ICCV, ECCV, NeruIPS, ICML, ICLR, MICCAI