## Zhe Gan

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## **Research Interests**

I am a Staff Research Scientist at Apple AI/ML, primarily working on building large-scale vision and multimodal foundation models. Before joining Apple, I was a Principal Researcher at Microsoft Azure AI. My research interest mainly focuses on Vision-Language Multimodal Intelligence. I also have broad interests on other machine learning topics, such as sparse neural networks, adversarial training, and self-supervised visual representation learning.

## **Education**

• Duke University, Durham, NC

Ph.D., Electrical and Computer Engineering

09/2013 - 03/2018

Peking University, Beijing, China

M.S., Electrical Engineering B.S., Electrical Engineering 09/2010 - 07/2013

09/2006 - 07/2010

# **Experience**

• Apple AI/ML

Staff Research Scientist.

11/2022 - now

Building large-scale vision and multimodal foundation models.

• Microsoft Cloud and AI

 Principal Researcher.
 09/2021 - 11/2022

 Senior Researcher.
 12/2018 - 09/2021

 Researcher.
 04/2018 - 12/2018

Building large-scale general-purpose multimodal foundation models that can be adopted to serve a wide range of Microsoft products, with downstream applications such as image classification, image retrieval, image captioning, object detection, segmentation, *etc*.

### • Information Initiative at Duke (iiD)

09/2013 - 03/2018

Research Assistant. Advisor: Prof. Lawrence Carin

- (i) Deep Bayesian Learning: developing deep generative models for computer vision and natural language processing applications, including VAE and GAN
- (ii) Bayesan Deep Learning: designing stochastic gradient variational inference algorithms and stochastic gradient MCMC methods for scalable Bayesian inference

## • Microsoft Research Redmond

05/2017 - 08/2017

Research Intern. Advisor: Xiaodong He, Lihong Li, Ph.D

- (i) Visual storytelling that aims to generate a story given an image input
- (ii) AttnGAN: text-to-image generation

### • Microsoft Research Redmond

05/2016 - 08/2016

Research Intern. Advisor: Xiaodong He, Jianfeng Gao, Li Deng, Ph.D

- (i) Image and video captioning
- (ii) Deep conflation for business data analytics

#### Adobe Research

06/2015 - 09/2015

Data Scientist Intern. Advisor: Hung Bui, Ph.D.

- (i) Recurrent neural networks (RNN) for text classification and generation
- (ii) Variational autoencoder for text modeling

# **Publications**

### arXiv preprints

- 1. H. You\*, H. Zhang\*, **Z. Gan**, X. Du, B. Zhang, Z. Wang, L. Cao, S.-F. Chang and Y. Yang "Ferret: Refer and Ground Anything Anywhere at Any Granularity", arXiv preprint arXiv:2310.07704
- 2. Z. Lai\*, H. Zhang\*, W. Wu, H. Bai, A. Timofeev, X. Du, **Z. Gan**, J. Shan, C.-N. Chuah, Y. Yang and M. Cao "From Scarcity to Efficiency: Improving CLIP Training via Visual-enriched Captions", arXiv preprint arXiv:2310.07699
- 3. T.-J. Fu, W. Hu, X. Du, W. Y. Wang, Y. Yang and **Z. Gan** "Guiding Instruction-based Image Editing via Multimodal Large Language Models", *arXiv* preprint arXiv:2309.17102
- 4. A. Jaiswal, **Z. Gan**, X. Du, B. Zhang, Z. Wang and Y. Yang "Compressing LLMs: The Truth is Rarely Pure and Never Simple", arXiv preprint arXiv:2310.01382
- 5. W. Wu\*, A. Timofeev\*, C. Chen, B. Zhang, K. Duan, S. Liu, Y. Zheng, J. Shlens, X. Du, **Z. Gan** and Y. Yang "MOFI: Learning Image Representations from Noisy Entity Annotated Images", *arXiv* preprint arXiv:2306.07952
- 6. J. Cho, L. Li, Z. Yang, **Z. Gan**, L. Wang and M. Bansal "Diagnostic Benchmark and Iterative Inpainting for Layout-Guided Image Generation", arXiv preprint arXiv:2304.06671

#### 2023

- 1. C. Li\*, **Z. Gan**\*, Z. Yang\*, J. Yang\*, L. Li\*, L. Wang and J. Gao "Multimodal Foundation Models: From Specialists to General-Purpose Assistants", Foundations and Trends in Computer Graphics and Vision, 2023. A survey book on multimodal foundation models
- Y.-L. Sung, L. Li, K. Lin, Z. Gan, M. Bansal and L. Wang "An Empirical Study of Multimodal Model Merging", Conf. on Empirical Methods in Natural Language Processing (Findings of EMNLP), 2023
- 3. X. Zou\*, Z.-Y. Dou\*, J. Yang\*, **Z. Gan**, L. Li, C. Li, X. Dai, H. Behl, J. Wang, L. Yuan, N. Peng, L. Wang, Y. J. Lee and J. Gao "Generalized Decoding for Pixel, Image, and Language", *Computer Vision and Pattern Recognition* (CVPR), 2023
- 4. Z. Yang, J. Wang, Z. Gan, L. Li, K. Lin, C. Wu, N. Duan, Z. Liu, C. Liu, M. Zeng and L. Wang "ReCo: Region-Controlled Text-to-Image Generation", Computer Vision and Pattern Recognition (CVPR), 2023
- 5. J. Zhou, L. Dong, **Z. Gan**, L. Wang and F. Wei "Non-Contrastive Learning Meets Language-Image Pre-Training", *Computer Vision and Pattern Recognition* (CVPR), 2023
- 6. L. Li, Z. Gan, K. Lin, C.-C. Lin, Z. Liu, C. Liu and L. Wang "LAVENDER: Unifying Video-Language Understanding as Masked Language Modeling", Computer Vision and Pattern Recognition (CVPR), 2023
- 7. T.-J. Fu\*, L. Li\*, **Z. Gan**, K. Lin, W. Wang, L. Wang and Z. Liu "An Empirical Study of End-to-End Video-Language Transformers with Masked Visual Modeling", *Computer Vision and Pattern Recognition* (CVPR), 2023
- 8. C. Si, **Z. Gan**, Z. Yang, S. Wang, J. Wang, J. Boyd-Graber and L. Wang "Prompting GPT-3 To Be Reliable", *Int. Conf. Learning Representations* (ICLR), 2023
- 9. J. Wu, J. Wang, Z. Yang, **Z. Gan**, Z. Liu, J. Yuan and L. Wang "GRiT: A Generative Region-to-text Transformer for Object Understanding", *arXiv* preprint arXiv:2212.00280
- 10. Z. Zhu\*, Y. Wei\*, J. Wang, Z. Gan, Z. Zhang, L. Wang, G. Hua, L. Wang, Z. Liu and H. Hu "Exploring Discrete Diffusion Models for Image Captioning", arXiv preprint arXiv:2211.11694

#### 2022

1. **Z. Gan**, L. Li, C. Li, L. Wang, Z. Liu and J. Gao "Vision-Language Pre-training: Basics, Recent Advances, and Future Trends", Foundations and Trends in Computer Graphics and Vision, 2022. A survey book on vision-language pre-training

- 2. J. Wang, Z. Yang, X. Hu, L. Li, K. Lin, Z. Gan, Z. Liu, C. Liu and L. Wang "GIT: A Generative Image-to-text Transformer for Vision and Language", Transactions on Machine Learning Research (TMLR), 2022. Our new multimodal foundation model that achieves 12 new SOTA on a diverse set of image/video captioning and QA tasks
- 3. C. Wu\*, J. Liang\*, X. Hu, **Z. Gan**, J. Wang, L. Wang, Z. Liu, Y. Fang and N. Duan "NUWA-Infinity: Autoregressive over Autoregressive Generation for Infinite Visual Synthesis", *Neural Information Processing Systems* (NeurIPS), 2022
- 4. Z.-Y. Dou\*, A. Kamath\*, **Z. Gan**\*, P. Zhang, J. Wang, L. Li, Z. Liu, C. Liu, Y. LeCun, N. Peng, J. Gao, L. Wang "Coarse-to-Fine Vision-Language Pre-training with Fusion in the Backbone", *Neural Information Processing Systems* (**NeurIPS**), 2022
- 5. S. Shen\*, C. Li\*, X. Hu\*, Y. Xie, J. Yang, P. Zhang, **Z. Gan**, L. Wang, L. Yuan, C. Liu, K. Keutzer, T. Darrell, A. Rohrbach and J. Gao "K-LITE: Learning Transferable Visual Models with External Knowledge", *Neural Information Processing Systems* (NeurIPS), 2022 Oral
- 6. Z. Yang, **Z. Gan**, J. Wang, X. Hu, F. Ahmed, Z. Liu, Y. Lu and L. Wang "UniTAB: Unifying Text and Box Outputs for Grounded Vision-Language Modeling", *European Conf. on Computer Vision* (ECCV), 2022 Oral, Top 2.7% among all submissions
- 7. T. Chen, Y. Cheng, **Z. Gan**, J. Wang, L. Wang, J. Liu and Z. Wang "Adversarial Feature Augmentation and Normalization for Visual Recognition", *Transactions on Machine Learning Research* (TMLR), 2022
- 8. Z. Dou, Y. Xu, **Z. Gan**, J. Wang, S. Wang, L. Wang, C. Zhu, P. Zhang, L. Yuan, N. Peng, Z. Liu and M. Zeng "An Empirical Study of Training End-to-End Vision-and-Language Transformers", *Computer Vision and Pattern Recognition* (CVPR), 2022
- 9. X. Hu, **Z. Gan**, J. Wang, Z. Yang, Z. Liu, Y. Lu and L. Wang "Scaling Up Vision-Language Pretraining for Image Captioning", *Computer Vision and Pattern Recognition* (CVPR), 2022
- 10. K. Lin\*, L. Li\*, C.-C. Lin\*, F. Ahmed, **Z. Gan**, Z. Liu, Y. Lu and L. Wang "SwinBERT: End-to-End Transformers with Sparse Attention for Video Captioning", *Computer Vision and Pattern Recognition* (CVPR), 2022
- 11. Z. Fang, J. Wang, X. Hu, L. Liang, **Z. Gan**, L. Wang, Y. Yang and Z. Liu "Injecting Semantic Concepts into End-to-End Image Captioning", *Computer Vision and Pattern Recognition* (CVPR), 2022
- 12. Z. Yang, Z. Gan, J. Wang, X. Hu, Y. Lu, Z. Liu and L. Wang "An Empirical Study of GPT-3 for Few-Shot Knowledge-Based VQA", *Proc. American Association of Artificial Intelligence* (AAAI), 2022 Oral, Leaderboard #1 on OK-VQA as of Nov. 4, 2021
- 13. **Z. Gan**, Y.-C. Chen, L. Li, T. Chen, Y. Cheng, S. Wang, J. Liu, L. Wang and Z. Liu "Playing Lottery Tickets with Vision and Language", *Proc. American Association of Artificial Intelligence* (AAAI), 2022 Oral
- 14. J. Chen, Y. Cheng, **Z. Gan**, Q. Gu and J. Liu "Efficient Robust Training via Backward Smoothing", *Proc. American Association of Artificial Intelligence* (**AAAI**), 2022
- 15. T.-J. Fu, L. Li, **Z. Gan**, K. Lin, W. Wang, L. Wang and Z. Liu "VIOLET: End-to-End Video-Language Transformers with Masked Visual-token Modeling", arXiv preprint arXiv:2111.12681
- 16. Y. Nie\*, L. Li\*, **Z. Gan**, S. Wang, C. Zhu, M. Zeng, Z. Liu, M. Bansal and L. Wang "MLP Architectures for Vision-and-Language Modeling: An Empirical Study", *arXiv preprint arXiv:2112.04453*
- 17. J. Wang, X. Hu, **Z. Gan**, Z. Yang, X. Dai, Z. Liu, Y. Lu and L. Wang "UFO: A UniFied TransfOrmer for Vision-Language Representation Learning", arXiv preprint arXiv:2111.10023

- 1. T. Chen, Y. Cheng, **Z. Gan**, L. Yuan, L. Zhang and Z. Wang "Chasing Sparsity in Vision Transformers: An End-to-End Exploration", *Neural Information Processing Systems* (**NeurIPS**), 2021
- 2. X. Chen, Y. Cheng, S. Wang, **Z. Gan**, J. Liu and Z. Wang "The Elastic Lottery Ticket Hypothesis", *Neural Information Processing Systems* (**NeurIPS**), 2021
- 3. T. Chen, Y. Cheng, **Z. Gan**, J. Liu and Z. Wang "Data-Efficient GAN Training Beyond (Just) Augmentations: A Lottery Ticket Perspective", *Neural Information Processing Systems* (NeurIPS), 2021

- 4. B. Wang\*, C. Xu\*, S. Wang, **Z. Gan**, Y. Cheng, J. Gao, A. H. Awadallah and B. Li "Adversarial GLUE: A Multi-Task Benchmark for Robustness Evaluation of Language Models", *Neural Information Processing Systems* (NeurIPS), Datasets and Benchmarks Track, 2021 Oral
- L. Li\*, J. Lei\*, Z. Gan, L. Yu, Y.-C. Chen, R. Pillai, Y. Cheng, L. Zhou, X. Wang, W. Wang, T. Berg, M. Bansal, J. Liu, L. Wang and Z. Liu "VALUE: A Multi-Task Benchmark for Video-and-Language Understanding Evaluation", Neural Information Processing Systems (NeurIPS), Datasets and Benchmarks Track, 2021
- 6. J. Chen, **Z. Gan**, X. Li, Q. Guo, L. Chen, S. Gao, T. Chung, Y. Xu, B. Zeng, W. Lu, F. Li, L. Carin and C. Tao "Simpler, Faster, Stronger: Breaking The log-K Curse On Contrastive Learners With FlatNCE", *Neural Information Processing Systems* (**NeurIPS**), Workshop on Self-Supervised Learning, 2021
- 7. L. Li, J. Lei, Z. Gan and J. Liu "Adversarial VQA: A New Benchmark for Evaluating the Robustness of VQA Models", Int. Conf. on Computer Vision (ICCV), 2021 Oral, Top 3% among all submissions
- 8. C. Zhu, Y. Cheng, **Z. Gan**, F. Huang, J. Liu and T. Goldstein "MaxVA: Fast Adaptation of Stepsizes by Maximizing Observed Variance of Gradients", *European Conf. Machine Learning* (**ECML**), 2021
- 9. X. Chen, Y. Cheng, S. Wang, **Z. Gan**, Z. Wang and J. Liu "EarlyBERT: Efficient BERT Training via Early-bird Lottery Tickets", *Association for Computational Linguistics* (ACL), 2021 Oral
- S. Wang, L. Zhou, Z. Gan, Y.-C. Chen, Y. Fang, S. Sun, Y. Cheng and J. Liu "Cluster-Former: Clustering-based Sparse Transformer for Question Answering", Findings of Association for Computational Linguistics (Findings of ACL), 2021 Leaderboard #1 on NaturalQuestions as of Sep. 27, 2020
- 11. J. Lei\*, L. Li\*, L. Zhou, **Z. Gan**, T. L. Berg, M. Bansal and J. Liu "Less is More: ClipBERT for Video-and-Language Learning via Sparse Sampling", *Computer Vision and Pattern Recognition* (CVPR), 2021 Oral with 3 Strong Accepts, Best Student Paper Honorable Mention
- 12. L. Chen\*, D. Wang\*, **Z. Gan**, J. Liu, R. Henao and L. Carin "Wasserstein Contrastive Representation Distillation", *Computer Vision and Pattern Recognition* (CVPR), 2021
- 13. S. Dai, **Z. Gan**, Y. Cheng, C. Tao, L. Carin and J. Liu "APo-VAE: Text Generation in Hyperbolic Space", North American Chapter of the Association for Computational Linguistics (NAACL), 2021
- 14. B. Wang, S. Wang, Y. Cheng, **Z. Gan**, R. Jia, B. Li and J. Liu "InfoBERT: Improving Robustness of Language Models from An Information Theoretic Perspective", *Int. Conf. Learning Representations* (ICLR), 2021 Leaderboard #1 on Adversarial NLI as of Oct. 9, 2020
- 15. S. Yuan\*, P. Cheng\*, R. Zhang, W. Hao, **Z. Gan** and L. Carin "Improving Zero-Shot Voice Style Transfer via Disentangled Representation Learning", *Int. Conf. Learning Representations* (ICLR), 2021
- 16. Y. Fang\*, S. Wang\*, **Z. Gan**, S. Sun and J. Liu "FILTER: An Enhanced Fusion Method for Crosslingual Language Understanding", *Proc. American Association of Artificial Intelligence* (**AAAI**), 2021 Leaderboard #1 on XTREME and XGLUE as of Sep. 8, 2020
- 17. W. Chen, **Z. Gan**, L. Li, Y. Cheng, W. Wang and J. Liu "Meta Module Network for Compositional Visual Reasoning", Winter Conf. on Applications of Computer Vision (WACV), 2021 Best Student Paper Honorable Mention
- 18. L. Zhou, J. Liu, Y. Cheng, **Z. Gan**, and L. Wang "CUPID: Adaptive Curation of Pre-training Data for Video-and-Language Representation Learning", *arXiv* preprint arXiv:2104.00285
- 19. L. Li, **Z. Gan** and J. Liu "A Closer Look at the Robustness of Vision-and-Language Pre-trained Models", *arXiv* preprint *arXiv*:2012.08673 **SOTA** on 7 **VQA** robustness benchmarks as of April 23, 2021
- 20. Y. Fang, S. Wang, **Z. Gan**, S. Sun, J. Liu and C. Zhu "Accelerating Real-Time Question Answering via Question Generation", *arXiv* preprint arXiv:2009.05167
- 21. D. Wang, Y. Yang, C. Tao, **Z. Gan**, L. Chen, F. Kong, R. Henao and L. Carin "Proactive Pseudo-Intervention: Contrastive Learning For Interpretable Vision Models", *arXiv* preprint arXiv:2012.03369
- 22. M. Cheng, Z. Gan, Y. Cheng, S. Wang, C. Hsieh and J. Liu "Adversarial Masking: Towards Understanding Robustness Trade-off for Generalization", *OpenReview*

- 1. **Z. Gan**, Y.-C. Chen, L. Li, C. Zhu, Y. Cheng and J. Liu "Large-Scale Adversarial Training for Vision-and-Language Representation Learning", *Neural Information Processing Systems* (**NeurIPS**), 2020 **Spotlight, Top 4% among all submissions, SOTA on 6 Vision+Language tasks**
- 2. S. Sun, **Z. Gan**, Y. Cheng, Y. Fang, S. Wang and J. Liu "Contrastive Distillation on Intermediate Representations for Language Model Compression", *Conf. on Empirical Methods in Natural Language Processing* (EMNLP), 2020
- 3. S. Wang, Y. Fang, S. Sun, **Z. Gan**, Y. Cheng, J. Jiang and J. Liu "Cross-Thought for Sentence Encoder Pre-training", Conf. on Empirical Methods in Natural Language Processing (EMNLP), 2020
- 4. Y. Dong, S. Wang, **Z. Gan**, Y. Cheng, J. Cheung and J. Liu "Multi-Fact Correction in Abstractive Text Summarization", Conf. on Empirical Methods in Natural Language Processing (EMNLP), 2020
- 5. L. Li\*, Y.-C. Chen\*, Y. Cheng, **Z. Gan**, L. Yu and J. Liu "HERO: Hierarchical Encoder for Video+Language Omni-representation Pre-training", Conf. on Empirical Methods in Natural Language Processing (EMNLP), 2020 SOTA on 8 Video+Language datasets, Leaderboard #1 on TVR and TVC as of Sep. 15, 2020
- 6. Y. Zhang\*, G. Wang\*, C. Li, **Z. Gan**, C. Brockett and B. Dolan "POINTER: Constrained Progressive Text Generation via Insertion-based Generative Pre-training", *Conf. on Empirical Methods in Natural Language Processing* (EMNLP), 2020
- 7. Y. Fang, S. Sun, **Z. Gan**, R. Pillai, S. Wang and J. Liu "Hierarchical Graph Network for Multihop Question Answering", arXiv preprint arXiv:1911.03631 Conf. on Empirical Methods in Natural Language Processing (EMNLP), 2020 Leaderboard #1 on HotpotQA as of Dec. 1st, 2019
- 8. Y. Cheng, **Z. Gan**, Y. Zhang, O. Elachqar, D. Li and J. Liu "Contextual Text Style Transfer", Findings of Empirical Methods in Natural Language Processing (Findings of EMNLP), 2020
- 9. Y. Wei, **Z. Gan**, W. Li, S. Lyu, M.-C. Chang, L. Zhang, J. Gao and P. Zhang "MagGAN: High-Resolution Face Attribute Editing with Mask-Guided Generative Adversarial Network", *Asian Conf. on Computer Vision* (ACCV), 2020
- 10. S. Dai, Y. Cheng, Y. Zhang, **Z. Gan**, J. Liu and L. Carin "Contrastively Smoothed Class Alignment for Unsupervised Domain Adaptation", *Asian Conf. on Computer Vision* (ACCV), 2020
- 11. J. Cao, **Z. Gan**, Y. Cheng, L. Yu, Y.-C. Chen and J. Liu "Behind the Scene: Revealing the Secrets of Pre-trained Vision-and-Language Models", *European Conf. on Computer Vision* (ECCV), 2020 Spotlight (Top 5% among all submissions)
- 12. Y.-C. Chen\*, L. Li\*, L. Yu\*, A. Kholy, F. Ahmed, **Z. Gan**, Y. Cheng and J. Liu "UNITER: UNiversal Image-TExt Representation Learning", *European Conf. on Computer Vision* (ECCV), 2020 SOTA on 13 Vision+Language Datasets/Tasks, No. 1 on VCR and NLVR2 leaderboards as of Sep. 2019
- 13. Y. Cheng, **Z. Gan**, Y. Li, J. Liu and J. Gao "Sequential Attention GAN for Interactive Image Editing", *ACM International Conference on Multimedia* (**ACMMM**), 2020
- 14. P. Cheng, W. Hao, S. Dai, J. Liu, **Z. Gan** and L. Carin "CLUB: A Contrastive Log-ratio Upper Bound of Mutual Information", *Int. Conf. Machine Learning* (ICML), 2020
- 15. L. Chen, **Z. Gan**, Y. Cheng, L. Li, L. Carin and J. Liu "Graph Optimal Transport for Cross-Domain Alignment", *Int. Conf. Machine Learning* (**ICML**), 2020
- 16. J. Xu, **Z. Gan**, Y. Cheng and J. Liu "Discourse-Aware Neural Extractive Text Summarization", *Association for Computational Linguistics* (**ACL**), 2020
- 17. Y. Chen, **Z. Gan**, Y. Cheng, J. Liu and J. Liu "Distilling Knowledge Learned in BERT for Text Generation", Association for Computational Linguistics (ACL), 2020
- 18. R. Zhang, C. Chen, **Z. Gan**, W. Wang, D. Shen, G. Wang, Z. Wen and L. Carin "Improving Adversarial Text Generation by Modeling the Distant Future", *Association for Computational Linguistics* (ACL), 2020
- 19. Y. Li, Y. Cheng, **Z. Gan**, L. Yu, L. Wang and J. Liu "BachGAN: High-Resolution Image Synthesis from Salient Object Layout", *Computer Vision and Pattern Recognition* (**CVPR**), 2020

- 20. J. Liu, W. Chen, Y. Cheng, **Z. Gan**, L. Yu, Y. Yang and J. Liu "VIOLIN: A Large-Scale Dataset for Video-and-Language Inference", *Computer Vision and Pattern Recognition* (CVPR), 2020
- 21. R. Zhang, C. Chen, **Z. Gan**, Z. Wen, W. Wang and L. Carin "Nested-Wasserstein Self-Imitation Learning for Sequence Generation", *Artificial Intelligence and Statistics* (AISTATS), 2020
- 22. C. Zhu, Y. Cheng, **Z. Gan**, S. Sun, T. Goldstein and J. Liu "FreeLB: Enhanced Adversarial Training for Natural Language Understanding", *Int. Conf. Learning Representations* (ICLR), 2020 Spotlight (Leaderboard #1 on GLUE, ARC Easy/Challenge and Commonsense QA as of Sep. 2019)
- 23. W. Wang, H. Xu, **Z. Gan**, B. Li, G. Wang, L. Chen, Q. Yang, W. Wang and L. Carin "Graph-Driven Generative Models for Heterogeneous Multi-Task Learning", *Proc. American Association of Artificial Intelligence* (AAAI), 2020 Spotlight
- 24. J. Hu, Y. Cheng, **Z. Gan**, J. Liu, J. Gao and G. Neubig "What Makes A Good Story? Designing Composite Rewards for Visual Storytelling", *Proc. American Association of Artificial Intelligence* (AAAI), 2020 Spotlight

- 1. W. Wang, C. Tao, **Z. Gan**, G. Wang, L. Chen, X. Zhang, R. Zhang, Q. Yang, R. Henao and L. Carin "Improving Textual Network Learning with Variational Homophilic Embeddings", *Neural Information Processing Systems* (NeurIPS), 2019
- 2. S. Sun, Y. Cheng, **Z. Gan**, and J. Liu "Patient Knowledge Distillation for BERT Model Compression", Conf. on Empirical Methods in Natural Language Processing (EMNLP), 2019
- 3. H. Wang, Z. Gan, X. Liu, J. Liu, J. Gao and H. Wang "Adversarial Domain Adaptation for Machine Reading Comprehension", Conf. on Empirical Methods in Natural Language Processing (EMNLP), 2019
- 4. D. Li, Y. Zhang, **Z. Gan**, Y. Cheng, C. Brockett, M. Sun and B. Dolan "Domain Adaptive Text Style Transfer", Conf. on Empirical Methods in Natural Language Processing (EMNLP), 2019
- 5. M. Jiang, Q. Huang, L. Zhang, X. Wang, P. Zhang, **Z. Gan**, J. Diesner and J. Gao "TIGEr: Text-to-Image Grounding for Image Caption Evaluation", *Conf. on Empirical Methods in Natural Language Processing* (EMNLP), 2019
- 6. L. Li, **Z. Gan**, Y. Cheng and J. Liu "Relation-Aware Graph Attention Network for Visual Question Answering", *Int. Conf. on Computer Vision* (ICCV), 2019
- 7. **Z. Gan**, Y. Cheng, A. Kholy, L. Li, J. Liu and J. Gao "Multi-step Reasoning via Recurrent Dual Attention for Visual Dialog", *Association for Computational Linguistics* (**ACL**), 2019
- 8. L. Ke, X. Li, Y. Bisk, A. Holtzman, Z. Gan, J. Liu, J. Gao, Y. Choi, and S. Srinivasa "Tactical Rewind: Self-Correction via Backtracking in Vision-and-Language Navigation", *Computer Vision and Pattern Recognition* (CVPR), 2019 Oral
- 9. Y. Li, **Z. Gan**, Y. Shen, J. Liu, Y. Cheng, Y. Wu, L. Carin, D. Carlson and J. Gao "StoryGAN: A Sequential Conditional GAN for Story Visualization", *Computer Vision and Pattern Recognition* (CVPR), 2019
- 10. W. Wang, **Z. Gan**, H. Xu, R. Zhang, G. Wang, D. Shen, C. Chen and L. Carin "Topic-Guided Variational Autoencoders for Text Generation", North American Chapter of the Association for Computational Linguistics (NAACL), 2019 Oral
- 11. L. Chen, Y. Zhang, R. Zhang, C. Tao, **Z. Gan**, H. Zhang, B. Li, D. Shen, C. Chen and L. Carin "Improving Sequence-to-Sequence Learning via Optimal Transport", *Int. Conf. Learning Representations* (ICLR), 2019
- 12. Q. Huang\*, **Z. Gan**\*, A. Celikyilmaz, D. Wu, J. Wang and X. He "Hierarchically Structured Reinforcement Learning for Topically Coherent Visual Story Generation", *Proc. American Association of Artificial Intelligence* (**AAAI**), 2019 **Spotlight**

#### 2018

1. Y. Zhang, M. Galley, J. Gao, **Z. Gan**, X. Li, C. Brockett and B. Dolan "Generating Informative and Diverse Conversational Responses via Adversarial Information Maximization", *Neural Information Processing Systems* (NeurIPS), 2018

- 2. L. Chen, S. Dai, C. Tao, D. Shen, **Z. Gan**, H. Zhang, Y. Zhang and L. Carin "Adversarial Text Generation via Feature-Mover's Distance", *Neural Information Processing Systems* (**NeurIPS**), 2018
- 3. X. Zhang, R. Henao, **Z. Gan**, Y. Li and L. Carin "Multi-Label Learning from Medical Plain Text with Convolutional Residual Models", *Machine Learning for Healthcare* (MLHC), 2018 Spotlight
- 4. Y. Pu, S. Dai, **Z. Gan**, W. Wang, G. Wang, Y. Zhang, R. Henao and L. Carin "JointGAN: Multi-Domain Joint Distribution Learning with Generative Adversarial Nets", *Int. Conf. Machine Learning* (ICML), 2018
- 5. T. Xu, P. Zhang, Q. Huang, H. Zhang, Z. Gan, X. Huang and X. He "AttnGAN: Fine-Grained Text to Image Generation with Attentional Generative Adversarial Networks", Computer Vision and Pattern Recognition (CVPR), 2018
- 6. W. Wang, Z. Gan, W. Wang, D. Shen, J. Huang, W. Ping, S. Satheesh and L. Carin "Topic Compositional Neural Language Model", *Artificial Intelligence and Statistics* (AISTATS), 2018
- 7. Y. Pu, M. R. Min, **Z. Gan** and L. Carin "Adaptive Feature Abstraction for Translating Video to Text", *Proc. American Association of Artificial Intelligence* (**AAAI**), 2018

- 1. **Z. Gan**\*, L. Chen\*, W. Wang, Y. Pu, Y. Zhang, H. Liu, C. Li and L. Carin "Triangle Generative Adversarial Networks", *Neural Information Processing Systems* (NeurIPS), 2017
- 2. Y. Pu, W. Wang, R. Henao, L. Chen, **Z. Gan**, C. Li, and L. Carin "Adversarial Symmetric Variational Autoencoder", *Neural Information Processing Systems* (NeurIPS), 2017
- 3. Y. Pu, **Z. Gan**, R. Henao, C. Li, S. Han and L. Carin "VAE Learning via Stein Variational Gradient Descent", *Neural Information Processing Systems* (**NeurIPS**), 2017
- 4. Y. Zhang, D. Shen, G. Wang, **Z. Gan**, R. Henao and L. Carin "Deconvolutional Paragraph Representation Learning", *Neural Information Processing Systems* (**NeurIPS**), 2017
- 5. **Z. Gan**, Y. Pu, R. Henao, C. Li, X. He and L. Carin "Learning Generic Sentence Representations Using Convolutional Neural Networks", *Conf. on Empirical Methods in Natural Language Processing* (EMNLP), 2017 Oral
- 6. Y. Zhang, **Z. Gan**, K. Fan, Z. Chen, R. Henao, D. Shen and L. Carin "Adversarial Feature Matching for Text Generation", *Int. Conf. Machine Learning* (ICML), 2017
- 7. Y. Zhang, C. Chen, **Z. Gan**, R. Henao and L. Carin "Stochastic Gradient Monomial Gamma Sampler", Int. Conf. Machine Learning (ICML), 2017
- 8. **Z. Gan**\*, C. Li\*, C. Chen, Y. Pu, Q. Su and L. Carin "Scalable Bayesian Learning of Recurrent Neural Networks for Language Modeling", Association for Computational Linguistics (**ACL**), 2017 **Oral**
- 9. **Z. Gan**, C. Gan, X. He, Y. Pu, K. Tran, J. Gao, L. Carin and L. Deng "Semantic Compositional Networks for Visual Captioning", *Computer Vision and Pattern Recognition* (CVPR), 2017 Spotlight
- 10. C. Gan, **Z. Gan**, X. He, J. Gao and L. Deng "StyleNet: Generating Attractive Visual Captions with Styles", Computer Vision and Pattern Recognition (CVPR), 2017
- 11. **Z. Gan**, P. D. Singh, A. Joshi, X. He, J. Chen, J. Gao and L. Deng "Character-level Deep Conflation for Business Data Analytics", *Int. Conf. Acoustics, Speech and Signal Processing* (ICASSP), 2017
- 12. Y. Xian, Y. Pu, **Z. Gan**, L. Lu and A. Thompson "Adaptive DCTNet for Audio Signal Classification", *Int. Conf. Acoustics, Speech and Signal Processing* (ICASSP), 2017
- 13. Q. Su, X. Liao, C. Li, **Z. Gan** and L. Carin "Unsupervised Learning with Truncated Gaussian Graphical Models", *Proc. American Association of Artificial Intelligence* (**AAAI**), 2017 Oral

#### 2016

- 1. Y. Zhang, **Z. Gan** and L. Carin "Generating Text via Adversarial Training", NeurIPS Workshop, 2016
- 2. Y. Xian, Y. Pu, **Z. Gan**, L. Lu and A. Thompson "Modified DCTNet for Audio Signals Classification", *Journal of the Acoustical Society of America*, 2016

- 3. Y. Pu, **Z. Gan**, R. Henao, X. Yuan, C. Li, A. Stevens and L. Carin "Variational Autoencoder for Deep Learning of Images, Labels and Captions", *Neural Information Processing Systems* (NeurIPS), 2016
- 4. J. Song, **Z. Gan** and L. Carin "Factored Temporal Sigmoid Belief Networks for Sequence Learning", *Int. Conf. Machine Learning* (ICML), 2016
- 5. C. Li, A. Stevens, C. Chen, Y. Pu, **Z. Gan** and L. Carin "Learning Weight Uncertainty with Stochastic Gradient MCMC for Shape Classification", *Computer Vision and Pattern Recognition* (CVPR), 2016 Spotlight
- 6. C. Chen, D. Carlson, **Z. Gan**, C. Li and L. Carin "Bridging the Gap Between Stochastic Gradient MCMC and Stochastic Optimization", *Artificial Intelligence and Statistics* (**AISTATS**), 2016 Oral

- 1. **Z. Gan**, C. Li, R. Henao, D. Carlson and L. Carin "Deep Temporal Sigmoid Belief Networks for Sequence Modeling", *Neural Information Processing Systems* (**NeurIPS**), 2015
- 2. R. Henao, **Z. Gan**, J. Lu and L. Carin "Deep Poisson Factor Modeling", Neural Information Processing Systems (NeurIPS), 2015
- 3. **Z. Gan**, C. Chen, R. Henao, D. Carlson and L. Carin "Scalable Deep Poisson Factor Analysis for Topic Modeling", *Int. Conf. Machine Learning* (ICML), 2015
- 4. **Z. Gan**, R. Henao, D. Carlson and L. Carin "Learning Deep Sigmoid Belief Networks with Data Augmentation", *Artificial Intelligence and Statistics* (AISTATS), 2015
- 5. **Z. Gan**, X. Yuan, R. Henao, E. Tsalik and L. Carin "Inference of Gene Networks Associated with the Host Response to Infectious Disease", Chapter 13 of Book *Big Data Over Networks*. Cambridge University Press. In Press.

#### PhD Dissertation

1. **Z. Gan** "Deep Generative Models for Vision and Language Intelligence", Duke University.

## **Tutorial and Workshop**

- 1. L. Li, **Z. Gan**, C. Li, J. Yang and Z. Yang "Recent Advances in Vision Foundation Models", *Computer Vision and Pattern Recognition* (CVPR), 2023
- 2. **Z. Gan**, L. Li, C. Li, J. Yang, P. Zhang, L. Wang, Z. Liu and J. Gao "Recent Advances in Vision-and-Language Pre-training", *Computer Vision and Pattern Recognition* (CVPR), 2022
- 3. M. Luo, T. Gokhale, Z. Fang, P. Banerjee, Y. Yang, C. Baral, D. Teney, **Z. Gan**, K. Marino, T. Wang and S. Aditya "O-DRUM: Workshop on Open-Domain Retrieval Under a Multi-Modal Setting", *Computer Vision and Pattern Recognition* (CVPR), 2022
- 4. Z. Gan, C. Li, J. Yang and P. Zhang "Microsoft Vision+Language Summer Talk Series", 2021
- 5. P. Anderson, Y. Artzi, **Z. Gan**, X. He, L. Li, J. Liu, X. Wang, Q. Wu and L. Zhou "From VQA to VLN: Recent Advances in Vision-and-Language Research", *Computer Vision and Pattern Recognition* (CVPR), 2021
- 6. **Z. Gan**, L. Yu, Y. Cheng, L. Zhou, L. Li, Y.-C. Chen, J. Liu and X. He "Recent Advances in Visionand-Language Research", *Computer Vision and Pattern Recognition* (CVPR), 2020
- 7. P. Knees and **Z. Gan** "The ACM Multimedia 2020 Interactive Arts Exhibition"

## **Professional Activities**

## Area Chair for Top-tier AI Conferences:

- 2024: CVPR, ICLR
- 2023: NeurIPS, ICML, ICLR, CVPR, EMNLP, AAAI, IJCNLP-AACL
- 2022: NeurIPS, ICML, ECCV, ACL, NAACL, EMNLP, AAAI
- 2021: NeurIPS, ICML, ICLR, ACL

2020: NeurIPS2019: NeurIPS

Senior Program Committee (SPC) Member: AAAI 2021/2020

Action Editor: Transactions on Machine Learning Research (TMLR), ACL Rolling Review

Interactive Arts Chair: ACMMM 2020

Awarded as Outstanding SPC Member: AAAI 2020

Awarded as Top/Outstanding Reviewer: EMNLP 2020, ICML 2020, NeurIPS 2018

### Conference Reviewer/PC Member:

- 2022: ICLR, CVPR, WACV
- 2021: CVPR, ICCV, WACV; NAACL, EMNLP
- 2020: ICML, ICLR, IJCAI; CVPR, ECCV, ACMMM; ACL, EMNLP, COLING, AACL, CONLL
- 2019: ICML, ICLR, AAAI; CVPR, ICCV, ACMMM; EMNLP, CoNLL
- 2018: NeurIPS, EMNLP, CVPR, ACCV
- 2016: NIPS

## Journal Reviewer:

- Transactions on Pattern Analysis and Machine Intelligence (PAMI)
- Journal of Machine Learning Research (JMLR)
- Transactions on Image Processing (TIP)
- Transactions on Knowledge and Data Engineering (KDE)
- Journal of Selected Topics in Signal Processing (STSP)
- Transactions on Multimedia Computing Communications and Applications (TOMM)
- Transactions on Audio, Speech and Language Processing (ASL)
- Science China
- Transactions on Cybernetics, IET Computer Vision, Entropy, Artificial Intelligence

### Workshop Reviewer/PC Member:

- 2023: 3rd ACL Workshop on Advances in Language and Vision Research
- 2021: AAAI Workshop on Optimal Transport and Structured Data Modeling
- 2021: 4th ICCV Workshop on Closing the loop between Vision and Language
- 2021: NeurIPS Workshop on Disentanglement and Controllable Generation for Vision and Language
- 2021: 2nd NAACL Workshop on Advances in Language and Vision Research
- 2020: ACL Workshop on Advances in Language and Vision Research
- 2019: ICCV Workshop on Closing the loop between Vision and Language
- 2019: ICLR Workshop on Deep Generative Models for Highly Structured Data
- 2018: ICML Workshop on Theoretical Foundations and Applications of Deep Generative Models

#### **Talks**

- "Recent Advances in Vision Foundation Models", CVPR Tutorial, Vancouver, Canada, June 2023
- "Towards Building Multimodal Foundation Models", WACV Tutorial, Zoom, January 2023
- "Towards Building Multimodal Foundation Models", *Ohio State University (OSU)*, Zoom, November 2022
- "Towards Building Multimodal Foundation Models", Apple AI/ML, Zoom, October 2022

- "Finding Universal Lottery Tickets in Large Neural Networks Efficiently", Fudan University, Zoom, August 2022
- "Big Models, Few-shot Learning, and Model Evaluation for Vision-Language Pre-training", CVPR Tutorial, New Orleans, USA, June 2022
- "Neural Networks for NLP", Duke Machine Learning Summer School, Zoom, June 2022
- "Vision-Language Pre-training for Multimodal Intelligence", Google Brain, Zoom, May 2022
- "Playing Lottery Tickets with Vision and Language", AAAI, Zoom, February 2022
- "Compressing Transformers with Knowledge Distillation and Pruning", Baidu Research, Zoom, January 2022
- "How Much Can GPT-3 Benefit Few-Shot Visual Reasoning?", Microsoft Research Summit, October
- "Vision-and-Language Pre-training: Basics, Recent Advances, and Future Directions", *University of California, Merced*, Zoom, October 2021
- "Large-scale Vision-and-Language Pre-training for Multimodal Learning", Keynote at the 3rd Workshop on Continual and Multimodal Learning for Internet of Things, IJCAI, Zoom, August 2021
- "Recent Advances in Vision-Language Pre-training", University of Bristol, Zoom, June 2021
- "Recent Advances in Vision-Language Pre-training", Wuhan University, Zoom, May 2021
- "Recent Advances in Vision-Language Pre-training", *University of California, Santa Cruz (UCSC)*, Zoom, May 2021
- "Vision-Language Pre-training", Student Forum on Frontiers of AI (SFFAI), Zoom, April 2021
- "Large-Scale Adversarial Training for Vision-and-Language Representation Learning", NeurIPS, Zoom, December 2020
- "Visual QA and Reasoning", CVPR Tutorial, Zoom, June 2020
- "Deep Generative Models for Vision and Language Intelligence", Ph.D. Final Defense, Durham, NC, February 2018
- "Deep Generative Models for Vision and Language Intelligence", IBM Thomas J. Watson Research Center, Yorktown, NY, October 2017
- "Deep Generative Models for Vision and Language Intelligence", NVIDIA, Santa Clara, CA, September 2017
- "Deep Generative Models for Vision and Language Intelligence", Apple, Cupertino, CA, September 2017
- "Learning Generic Sentence Representations Using Convolutional Neural Networks", EMNLP, Copenhagen, Denmark, September 2017
- "Semantic Compositional Networks for Visual Captioning", CVPR, Hawaii, July 2017
- "Semantic Compositional Networks for Visual Captioning", Ph.D. Preliminary Exam, Durham, NC, April 2017
- "Deep Generative Models for Sequence Learning", Ph.D. Qualifying Exam, Durham, NC, December 2015

### **Competitions**

- 2022/06: First human parity on TextCaps, and Rank 1st on NoCaps and VizWiz leaderboards
- 2021/09: Rank 1st on OK-VQA leaderboard
- 2021/06: Rank 1st on TextCaps Challenge 2021
- 2020/10: Rank 1st on Adversarial NLI leaderboard
- 2020/09: Rank 1st on NaturalQuestions leaderboard
- 2020/09: Rank 1st on TVR and TVC leaderboards

- 2020/09: Rank 1st on XTREME and XGLUE leaderboards
- 2020/05: Rank 4th on VQA Challenge 2020
- 2019/12: Rank 1st on HotpotQA leaderboard
- 2019/10: Rank 1st on VCR and NLVR2 leaderboards
- 2019/09: Rank 1st on GLUE, ARC Easy/Challenge and Commonsense QA leaderboards
- 2019/06: Rank 2nd in Visual Dialog Challenge 2019
- 2018/09: Rank 3rd in Visual Dialog Challenge 2018

## **Awards**

- CVPR 2021 Best Student Paper Honorable Mention
- WACV 2021 Best Student Paper Honorable Mention
- AAAI 2020 Outstanding Senior Program Committee Member Award
- ECE Fellowship, Duke University, 2013
- National Scholarship, Department of Minister of Education of China, 2010-2013