# Zhe Gan

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### **Research Interests**

I am a Principal Researcher at Microsoft Azure AI, primarily working on building large-scale general-purpose multimodal foundation models. 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
 09/2010 - 07/2013

 B.S., Electrical Engineering
 09/2006 - 07/2010

# Experience

### • Microsoft Cloud and AI

 Principal Researcher.
 09/2021 - present

 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 Data Crimatical Internal Administra Llarge Pari Planta Properties

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

# **Research Highlights**

# **Multimodal Foundation Models**

- 1. NUWA Infinity is our new multimodal generative model that is able to generate high-quality images and videos from given text or image input. We can generate images with resolution up to 38912 × 2048 pixels. Check our project website at https://nuwa-infinity.microsoft.com.
- 2. Florence-GIT is our new multimodal generative foundation model, where we have trained a simple image-to-text transformer with 5.1B parameters on 12.9B image-text pairs. GIT achieves new state of the art across 12 image/video captioning and QA tasks, including the first human-parity on TextCaps. GIT achieves an accuracy of 88.79% on ImageNet-1k using a generative scheme. GIT has encoded rich multi-modal knowledge about the visual world, and can recognize scene text, tables/charts, food, logos, landmarks, characters, products, etc.

## **Unified Multimodal Modeling**

- 1. **FIBER** is our unified solution for Alexander MM vNext exploration, where we aim to design a foundation model that can flexibly serve as an image encoder, an image-text dual encoder, a fusion encoder, and an image-to-text encoder-decoder, for different downstream applications.
- 2. **UniTAB** is our ECCV 2022 Oral paper that aims to unify text generation and bounding box prediction into a single transformer encoder-decoder architecture, via representing each bounding box as a few discrete tokens, inspired by Pix2seq. This enables UniTAB to approach different vision-language tasks with a single set of parameters.

# Early Research Highlights

- 1. Our UNITER model is one of the pioneering works for Vision-Language Pre-training (VLP). After UNITER, we have developed a series of works such as VILLA and METER for image retrieval, captioning, and visual question answering, and HERO, ClipBERT, SwinBERT and VI-OLET for video captioning, retrieval, and question answering, where ClipBERT has won the Best Student Paper Honorable Mention Award at CVPR 2021. Our compositional visual reasoning work Meta Module Network has also won the Best Student Paper Honorable Mention Award at WACV 2021.
- 2. We have also worked on **Efficient AI**, where we have developed a series of work on using knowledge distillation and pruning techniques for large-scale transformer compression (*e.g.*, **PKD**, **EarlyBERT**, **SViTE**, *etc.*).

### **Publications**

# arXiv preprints

- 1. **Z. Gan**, L. Li, C. Li, L. Wang, Z. Liu and J. Gao "Vision-Language Pre-training: Basics, Recent Advances, and Future Trends", *arXiv* preprint arXiv:2210.09263
- 2. J. Zhou, L. Dong, **Z. Gan**, L. Wang and F. Wei "Non-Contrastive Learning Meets Language-Image Pre-Training", *arXiv* preprint arXiv:2210.09304
- 3. C. Si, **Z. Gan**, Z. Yang, S. Wang, J. Wang, J. Boyd-Graber and L. Wang "Prompting GPT-3 To Be Reliable", *arXiv preprint arXiv*:2210.09150
- 4. 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", arXiv preprint arXiv:2206.07160
- 5. 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", *arXiv* preprint arXiv:2209.01540

#### 2022

1. 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

- 2. 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
- 3. 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
- 4. 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
- 5. 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
- 6. 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
- 7. 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
- 8. 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
- 9. K. Lin\*, L. Li\*, C.-C. Lin\*, F. Ahmed, **Z. Gan**, Z. Liu, Y. Lu and L. Wang "SwinBERT: Endto-End Transformers with Sparse Attention for Video Captioning", *Computer Vision and Pattern Recognition* (**CVPR**), 2022
- 10. 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
- 11. 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**
- 12. **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
- 13. 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
- 14. 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
- 15. 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
- 16. 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

- 5. 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
- 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
- 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

# **Book Chapter**

1. **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. **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
- 2. 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
- 3. Z. Gan, C. Li, J. Yang and P. Zhang "Microsoft Vision+Language Summer Talk Series", 2021
- 4. 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
- 5. **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
- 6. P. Knees and Z. Gan "The ACM Multimedia 2020 Interactive Arts Exhibition"

### **Professional Activities**

# Area Chair for Top-tier AI Conferences:

- 2023: ICLR, CVPR, AAAI
- 2022: NeurIPS, ICML, ECCV, ACL, NAACL, EMNLP, AAAI
- 2021: NeurIPS, ICML, ICLR, ACL
- 2020: NeurIPS
- 2019: 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**

- "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 2021
- "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