# **Tianqing Fang**

http://www.fangtq.com

#### Research Interest

- Knowledge Acquisition: Acquisition of commonsense knowledge, knowledge conflicts, and complex knowledge with information extraction, crowdsourcing, and LLM distillation.
- Knowledge Injection and Reasoning on LLMs (Lightweight) injection of knowledge, including constrained decoding, retrieval-augmented, and information-theoretic injections. Elicit complex reasoning ability of LLMs using internal/external knowledge, particularly on complex, counterfactual, long-tail, and long-context knowledge.
- Machine Learning for NLP: Data denoising; training dynamics; ...

#### **EDUCATION**

• Hong Kong University of Science and Technology (QS 2024 world rank 60)

Ph.D. of Computer Science; Supervisor: Yanggiu Song

Hong Kong SAR Aug. 2019 – June 2024

Email: tfangaa@cse.ust.hk

• Zhejiang University (QS 2024 world rank 44, top 4 in China)

Hangzhou, China

B.E. of Automation; GPA: 3.94/4.00, top 5%; Supervisor: Yang Yang

Aug. 2015 - June 2019

Minor Advanced Class of Engineering Education in Chu Ko Chen Honors College Special Scholarship Awardee, 2018 (top awards for undergraduate students, one per year)

## EXPERIENCE

• École Polytechnique Fédérale de Lausanne (EPFL)

Lausanne, Switzerland

Visiting Doctoral Student; Supervisor: Antoine Bosselut

Topic: Complex Commonsense Reasoning

July 2023 - Present

• University of Southern California

Los Angeles, CA

July 2022 - June 2023

Visiting Research Scholar; Supervisor: Muhao Chen

Topic: Event-level knowledge conflicts in LLMs; Denoising Data Augmentation

Hong Kong SAR

• NVIDIA

Research Intern; Supervisor: Ginny Y. Wong and Simon See Topic: Semi-supervised learning on commonsense reasoning Feb. 2022 - June 2022

PUBLICATIONS

## Preprints:

## [1] On-the-fly Denoising for Data Augmentation in Natural Language Understanding

Tianqing Fang, Wenxuan Zhou, Fangyu Liu, Hongming Zhang, Yangqiu Song, and Muhao Chen arxiv.2212.10558, 2023

• A self-regularization + distillation enabled denoising framework for data augmentation in NLU.

# [2] Getting Sick After Seeing a Doctor? Diagnosing and Mitigating Knowledge Conflicts in Event Temporal Reasoning

Tianqing Fang, Zhaowei Wang, Wenxuan Zhou, Hongming Zhang, Yangqiu Song, Muhao Chen. arxiv.2212.10558, 2023

• Define and study knowledge conflicts in event temporal reasoning, and propose data-augmentation driven mitigation methods for both Pre-trained Language Models (PLMs) and Large Language Models (LLMs).

#### [3] Acquiring and Modelling Abstract Commonsense Knowledge via Conceptualization

Mutian He, Tianqing Fang, Weiqi Wang, and Yangqiu Song.

Submitted to Journal of Artificial Intelligence. arxiv.2206.01532, 2022

• First work to study the role of conceptualization in event-based commonsense knowledge graphs. Identify the problem of "proper level of conceptualization" for commonsense understanding.

• Construct a contextualized and conceptualized ATOMIC knowledge graph with WordNet, Probase, and human annotation. For example, "(PersonX drinks milk, xAttr, thirsty)" can be conceptualized as "(PersonX drinks beverage, xAttr, thirsty)". But in "(PersonX drinks milk, xWant, to grow taller)", the head event cannot be conceptualized as "PersonX drinks beverage" but should be "PersonX drinks diary-product" in view of the context that PersonX wants to grow taller.

#### Conference:

# [4] KCTS: Knowledge-Constrained Tree Search Decoding with Token-Level Hallucination Detection

- Sehyun Choi, Tianqing Fang, Zhaowei Wang, Yangqiu Song
- EMNLP 2023
  - An inference-time algorithm based on Monte-Carlo Tree Search for future step estimation and a token-level hallucination detector, applicable for general LLMs.

# [5] CAR: Conceptualization-Augmented Reasoner for Zero-Shot Commonsense Question Answering

- Weiqi Wang\*, Tianqing Fang\*, Wenxuan Ding, Baixuan Xu, Xin Liu, Yangqiu Song, Antoine Bosselut
- Findings of EMNLP 2023
  - Use one-hop conceptualization to 1) augment ATOMIC, a commonsense knowledge graph. 2) to guide zero-shot question-answering pair generation to reduce false-negative options.
  - Zero-shot models outperform ChatGPT in several commonsense question answering benchmarks and achieve state-of-the-art.

# [6] QADYNAMICS: Training Dynamics-Driven Synthetic QA Diagnostic for Zero-Shot Commonsense Question Answering

- Haochen SHI, Weiqi Wang, Tianqing Fang, Baixuan Xu, Wenxuan Ding, Xin Liu, Yangqiu Song
- Findings of EMNLP 2023
  - A novel option-level training dynamics algorithms for selecting informative negative options. Achieving SOTA on zero-shot commonsense QA on five datasets.

#### [7] Doolittle: Benchmarks and Corpora for Academic Writing Formalization

- Shizhe Diao, Yongyu Lei, Liangming Pan, **Tianqing Fang**, Wangchunshu Zhou, Sedrick Scott Keh, Min-Yen Kan, Tong Zhang
- EMNLP 2023
  - A new benchmark for paragraph-level academic writing formalization. A metric-based RL method for improve LLMs' writing refinement ability.

# [8] STORYANALOGY: Deriving Story-level Analogies from Large Language Models to Unlock Analogical Understanding

- Jiayang Cheng, Lin Qiu, Tsz Ho CHAN, **Tianqing Fang**, Weiqi Wang, Chunkit Chan, Qipeng Guo, Hongming Zhang, Yangqiu Song, Yue Zhang, Zheng Zhang
- EMNLP 2023
  - A new benchmark for story-level analogy reasoning.

# [9] CAT: A Contextualized Conceptualization and Instantiation Framework for Commonsense Reasoning

- Weigi Wang\*, Tianging Fang\*, Baixuan Xu, Chun Yi Louis Bo, Yanggiu Song, Lei Chen.
- ACL 2023.
  - Semi-supervised conceptualization-instantiation framework for commonsense knowledge bases.

# [10] COLA: Contextualized Commonsense Causality Reasoning from the Causal Inference Perspective

- Zhaowei Wang, Quyet V. Do, Hongming Zhang, Jiayao Zhang, Weiqi Wang, **Tianqing Fang**, Yangqiu Song, Ginny Y. Wong, Simon See
- ACL 2023.

## [11] PseudoReasoner: Leveraging Pseudo Labels for Commonsense Knowledge Base Population

- Tianging Fang, Quyet V. Do, Hongming Zhang, Yanggiu Song, Ginny Y. Wong and Simon See
- Findings of EMNLP 2022.
  - Use the idea of pseudo labels to perform semi-supervised learning on CSKB Population, achieving state-of-the-art.
  - Propose a filtering strategy for pseudo labels using influence function and self distillation (the student model's own predictions).

# [12] MICO: A Multi-alternative Contrastive Learning Framework for Commonsense Knowledge Representation

- Ying Su, Zihao Wang, **Tianqing Fang**, Hongming Zhang, Yangqiu Song and Tong Zhang
- Findings of EMNLP 2022.
  - A novel commonsense knowledge embedding pipeline, well used for CSKB completion and zero-shot CSQAs.

## [13] SubeventWriter: Iterative Sub-event Sequence Generation with Coherence Controller

- Zhaowei Wang, Hongming Zhang, Tianqing Fang, Yangqiu Song, Ginny Y. Wong and Simon See
- EMNLP 2022.
  - An iterative neural text generation framework to generate multi-step instructions.

## [14] Weakly Supervised Text Classification using Supervision Signals from a Language Model

- Ziqian Zenq, Weimin Ni, **Tianqinq Fanq**, Xianq Li, Xinran Zhao, and Yanqqiu Sonq.
- Findings of Annual Conference of the North American Chapter of the Association for Computational Linguistics (Findings of NAACL). 2022.

## [15] Benchmarking Commonsense Knowledge Base Population with an Effective Evaluation Dataset

- Tianqing Fang\*, Weiqi Wang\*, Sehyun Choi, Shibo Hao, Hongming Zhang, Yangqiu Song, Bin He
- Conference on Empirical Methods in Natural Language Processing (EMNLP), 2021 (Main Conference).
  - Commonsense Knowledge Base (CSKB) Population is different from Completion as it requires reasoning over unseen assertions in external resources, while Completion only fills missing links within the CSKB.
  - Propose a dataset aligning four popular CSKBs, ConceptNet, ATOMIC, ATOMIC<sup>20</sup><sub>20</sub>, and GLUCOSE with a large-scale eventuality graph, ASER, to populate commonsense knowledge. ~31K triples are annotated as the evaluation set to check neural models' reasoning ability.
  - Developed KG-BertSAGE to better incorporate graph structures in the commonsense reasoning task.

#### [16] DISCOS: Bridging the Gap between Discourse Knowledge and Commonsense Knowledge

- Tianging Fang, Hongming Zhang, Weigi Wang, Yanggiu Song, and Bin He.
- The Web Conference (WWW), 2021.
  - Align the Commonsense Knowledge Base ATOMIC with a large-scale eventuality graph ASER. Use the knowledge in ATOMIC as ground-truth to train a reasoning model. Populate ATOMIC with novel edges in ASER .
  - Such commonsense knowledge acquisition method can alleviate selection bias and produce more diverse commonsense knowledge.

#### [17] Do Boat and Ocean Suggest Beach? Dialogue Summarization with External Knowledge

- Tianqing Fang, Haojie Pan, Hongming Zhang, Yangqiu Song, Kun Xu, Dong Yu.
- Conference on Automated Knowledge Base Construction (AKBC). 2021.
  - Address the situation where summarization may include something out of the dialogue context but can be implicitly inferred. Develop a knowledge-attention network to tackle this problem and achieves promising results.

#### [18] Probing Toxic Content in Large Pre-Trained Language Models

Nedjma Ousidhoum, Xinran Zhao, **Tianqing Fang**, Yangqiu Song, and Dit-Yan Yeung Annual Meeting of the Association for Computational Linguistics (ACL). 2021.

#### Journal:

# [19] ASER: Towards Large-scale Commonsense Knowledge Acquisition via Higher-order Selectional Preference over Eventualities

Hongming Zhang\*, Xin Liu\*, Haojie Pan\*, Haowen Ke, Jiefu Ou, **Tianqing Fang**, and Yangqiu Song. Artificial Intelligence. 2022

## ACADEMIC ACHIEVEMENTS

- HKUST Overseas Research Award (2023)
- HKUST RedBird Academic Excellence Award for Continuing PhD Students in 2022/23 (2023)
- HKUST RedBird Academic Excellence Award for Continuing PhD Students in 2021/22 (2022)
- Hong Kong Ph.D. Fellowship (2019-2023, top 100 Ph.D. students in all disciplines in Hong Kong, 41.5K USD per year)
- Special Scholarship for Undergraduate Students in Zhejiang University (One of the most prestigious awards for undergraduates in Zhejiang University) (2018)
- Provincial Scholarship (top 5% in 2017-2018, highest annual scholarship in Zhejiang Province) (2018)
- 1st Place and MATLAB Innovation Award (1st/36k+) in Contemporary Undergraduate Mathematical Contest in Modeling (The most authoritative mathematical modeling competition in China) (2017)
- Provincial Scholarship (top 5% in 2016-2017, highest annual scholarship in Zhejiang Province) (2017)
- National Scholarship (top 3% in 2015-2016, highest annual scholarship in China) (2016)

#### SKILLS

- **Programming skills**: C++, Python
- Languages: English (TOEFL 110, 26 in speaking), Mandarin Chinese (Native), Cantonese (Elementary).
- Miscs: I enjoy taking pictures. Some highlights are at https://unsplash.com/@tqfang.

#### Teaching

- MSBD 5018: Natural Language Processing (Spring 2022)
- COMP5222/MATH5471: Statistical Learning Models for Text and Graph Data. (Fall 2021)
- MSBD6000H: Natural Language Processing. (Spring 2021)
- COMP4901K/MATH4824B: Machine Learning for Natural Language Processing. (Fall 2020)
- COMP4332/RMBI4310: Big Data Mining. (Spring 2020, awarded best TA award in the CSE department.)

## MENTORING

- Haochen Shi: HKUST UG. QADynamics (Findings of EMNLP 2023).
- Weiqi Wang: HKUST UG → HKUST Ph.D., *Hong Kong Ph.D. Fellowship* Awardee. Worked on Commonsense Knowledge Acquisition and Reasoning (WWW 2021, EMNLP 2021, ACL 2023, Findings of EMNLP 2023).
- Van Quyet Do: HKUST UG → HKUST M.Phil. Worked on semi-supervised learning for commonsense knowledge base population (EMNLP 2022 and ongoing works).
- Sehyun Choi: HKUST UG → HKUST M.Phil., Asian Future Leaders Scholarship Program Awardee. Worked on graph neural networks for commonsense reasoning and knowledge-constrained decoding (EMNLP 2021 and EMNLP 2023).
- Shibo Hao: Peking University UG → UCSD Ph.D., worked on commonsense acquisition (EMNLP 2021).

#### Reference

#### • Dr. Yangqiu Song:

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#### • Dr. Muhao Chen:

Assistant Professor at UC Davis. Supervisor of my visit in USC. Email: muhaoche [at] usc [dot] edu

#### • Dr. Antoine Bosselut:

Assistant Professor at EPFL. Supervisor of my visit in EPFL. Email: antoine [dot] bosselut [at] epfl [dot] ch