Hassan Sajjad

Current Role Associate Professor

Director of HyperMatrix lab

Address: Faculty of Computer Science,

Goldberg Computer Science Building, Room 325

Dalhousie University, Halifax, Canada

Email: hsajjad@dal.ca

Webpage: https://hsajjad.github.io/
Google Scholar: https://goo.gl/H5XPzb

Languages Urdu (native), English (fluent), German (intermediate), Arabic (basic)

Research Interests

• Safe and Trustworthy AI - interpretability, explainability, ethical and fair AI, robustness, generalization, domain adaptation, language generation, model editing, social and safety alignment

Education

University of Stuttgart

Germany 2008–2012

PhD in Computer Science (Magna Cum Laude)

Thesis: Statistical models for unsupervised, semi-supervised and supervised transliteration mining

Advisor: Prof. Dr. Hinrich Schütze

Committee: Prof. Dr. Alex Waibel, PD Dr. Helmut Schmid, Dr. Alexander Fraser, Prof. Dr. Albrecht

Schmidt, Prof. Dr.-Ing Stefan Funke

National University of Computer and Emerging Sciences

Pakistan 2005–2007

Masters in Computer Science (CGPA 3.46)

Thesis: Part-of-speech tagging for Urdu

National University of Computer and Emerging Sciences

Pakistan

Bachelors in Computer Science (CGPA 3.45)

Project: Speaker recognition system

2001–2005

Professional Experience

Dalhousie University

Canada

Associate Professor

Aug. 2022

Qatar Computing Research Institute, HBKU

Qatar

Senior Research Scientist

Jan. 2021-Aug. 2022

Managed the projects on machine translation and the interpretation of deep neural networks

Qatar Computing Research Institute, HBKU

Qatar

Research Scientist Jan. 2014–Dec. 2020

Managed the research, development and commercialization of the machine translation project, and international collaborations - MIT and H2020 SUMMA project

Qatar Computing Research Institute, HBKU

Qatar

Post-doctoral Researcher

Feb. 2013-Jan. 2014

Worked on dialectal Arabic machine translation

University of Stuttgart

Germany

Research Assistant and PhD Scholar

Feb. 2008-Oct. 2012

Worked on unsupervised and semi-supervised methods

Microsoft Research

United States

Research Intern

Jul. 2011-Oct. 2011

Worked on efficient vertical search. US Patent 9,767,144

Center for Research in Urdu Language Processing, NUCES

Pakistan

Research Assistant

Feb. 2006-Feb. 2007

Worked on Pan Asian Networking Localization project

Publications

Peer-reviewed Journal Papers

Nadir Durrani, Fahim Dalvi, and **Hassan Sajjad**. "Discovering Salient Neurons in deep NLP models". In: *Journal of Machine Learning Research (JMLR)* 23-0074 (2023).

Hassan Sajjad, Fahim Dalvi, Nadir Durrani, and Preslav Nakov. "On the Effect of Dropping Layers of Pretrained Transformer Models". In: *Computer Speech Language (CSL)* 77 (2023), p. 101429. ISSN: 0885-2308. DOI: https://doi.org/10.1016/j.csl.2022.101429.

Hassan Sajjad, Nadir Durrani, and Fahim Dalvi. "Neuron-level Interpretation of Deep NLP Models: A Survey". In: *Transactions of the Association for Computational Linguistics (TACL)* 10 (2022), pp. 1285–1303. DOI: https://doi.org/10.1162/tacl_a_00519.

Reem Suwaileh, Tamer Elsayed, Muhammad Imran, and **Hassan Sajjad**. "When a Disaster Happens, We are Ready: Location Mention Recognition from Crisis Tweets". In: *International Journal of Disaster Risk Reduction (IJDRR)* 78 (2022). (link), pp. 103–107.

Prakhar Ganesh et al. "Compressing Large-Scale Transformer-Based Models: A Case Study on BERT". In: *Transactions of the Association for Computational Linguistics (TACL)* 9 (2021). (link).

Yonatan Belinkov, Nadir Durrani, Fahim Dalvi, **Hassan Sajjad**, and James Glass. "On the Linguistic Representational Power of Neural Machine Translation Models". In: *Computational Linguistics (CL)* (2020). (link).

Abdul Rafae, Asim Karim, **Hassan Sajjad**, Faisal Kamiran, and Jia Xu. "A Clustering Framework for Lexical Normalization of Roman Urdu". In: *Natural Language Engineering (NLE)* (2020). (link).

Shafiq Joty, Nadir Durrani, **Hassan Sajjad**, and Ahmed Abdelali. "Domain Adaptation using Neural Network Joint Model". In: *Computer Speech and Language (CSL)* 45.C (2017). (link). ISSN: 0885-2308.

Hassan Sajjad, Helmut Schmid, Alexander Fraser, and Hinrich Schütze. "Statistical models for unsupervised, semi-supervised and supervised transliteration mining". In: Computational Linguistics (CL) 43.2 (2017). (link).

Walid Magdy, **Hassan Sajjad**, Tarek El-Ganainy, and Fabrizio Sebastiani. "Bridging social media via distant supervision". In: *Social Network Analysis and Mining* 35.5 (2015). (link).

Peer-reviewed Conference Papers

David Arps, Laura Kallmeyer, Younes Samih, and **Hassan Sajjad**. "Multilingual Nonce Dependency Treebanks: Understanding how LLMs Represent and Process Syntactic Structure". In: *Proceedings of the Annual Conference of the North American Chapter of the Association for Computational Linguistics (NAACL)*. (link). Mexico City, Mexico, 2024.

Domenic Rosati et al. "Long-form Evaluation of Model Editing". In: *Proceedings of the Annual Conference of the North American Chapter of the Association for Computational Linguistics (NAACL)*. (link). Mexico City, Mexico, 2024.

Enes Altinisik, **Hassan Sajjad**, Husrev Taha Sencar, Safa Messaoud, and Sanjay Chawla. "Impact of Adversarial Training on Robustness and Generalizability of Language Models". In: *Proceedings of the Findings of Association for Computational Linguistics (ACL)*. (link). Toronto, Canada, July 2023.

Yu Yu, **Hassan Sajjad**, and Jia Xu. "Learning Uncertainty for Unknown Domains with Zero-Target-Assumption". In: *International Conference on Learning Representations (ICLR)*. (link). Kigali Rwanda, May 2023.

Yimin Fan, Fahim Dalvi, Nadir Durrani, and **Hassan Sajjad**. "Evaluating Neuron Interpretation Methods of NLP Models". In: *Thirty-seventh Conference on Neural Information Processing Systems (NeurIPS)*. New Orleans, US, Dec. 2023. URL: https://openreview.net/forum?id=YiwMpyMdPX.

David Arps, Younes Samih, Laura Kallmeyer, and **Hassan Sajjad**. "Probing for Constituency Structure in Neural Language Models". In: *Findings of the Conference on Empirical Methods in Natural Language Processing (EMNLP)*. (link). Abu Dhabi, 2022.

Fahim Dalvi, Abdul Rafae Khan, Firoj Alam, Nadir Durrani, Jia Xu, and **Hassan Sajjad**. "Discovering Latent Concepts Learned in BERT". In: *International Conference on Learning Representations (ICLR)*. (link). Online, 2022.

Nadir Durrani, **Hassan Sajjad**, Fahim Dalvi, and Firoj Alam. "On the Transformation of Latent Space in Fine-Tuned NLP Models". In: *Proceedings of the Conference on Empirical Methods in Natural Language Processing (EMNLP)*. (link). Abu Dhabi, 2022.

Hassan Sajjad, Nadir Durrani, Fahim Dalvi, Firoj Alam, Abdul Rafae Khan, and Jia Xu. "Analyzing Encoded Concepts in Transformer Language Models". In: *Proceedings of the Annual Conference of the North American Chapter of the Association for Computational Linguistics (NAACL)*. (link). Seattle, US, 2022.

Hassan Sajjad, Firoj Alam, Fahim Dalvi, and Nadir Durrani. "Effect of Post-processing on Contextualized Word Representations". In: *Proceedings of the International Conference on Computational Linguistics (COLING)*. (link). Gyeongju, Republic of Korea, Oct. 2022.

Nadir Durrani, **Hassan Sajjad**, and Fahim Dalvi. "How Transfer Learning Impacts Linguistic Knowledge in Deep NLP Models?" In: *Findings of the Association for Computational Linguistics (ACL-IJCNLP)*. (link). Online, Aug. 2021.

Firoj Alam, **Hassan Sajjad**, Muhammad Imran, and Ferda Ofli. "CrisisBench: Benchmarking Crisis-related Social Media Datasets for Humanitarian Information Processing". In: *International Conference on Web and Social Media (ICWSM)*. (link). Online, June 2021.

Firoj Alam et al. "Fighting the COVID-19 Infodemic in Social Media: A Holistic Perspective and a Call to Arms". In: *International Conference on Web and Social Media (ICWSM)*. (link). Online, June 2021.

Esther Seyffarth and Younes Samih, Laura Kallmeyer, and Hassan Sajjad. "Implicit Representations of Event Properties within Contextual Language Models: Searching for "Causativity Neurons". In: *International Conference on Computational Semantics (IWCS)*. (link). Groningen, Netherlands, June 2021.

Firoj Alam et al. "Fighting the COVID-19 Infodemic: Modeling the Perspective of Journalists, Fact-Checkers, Social Media Platforms, Policy Makers, and the Society". In: *Empirical Methods in Natural Language Processing (EMNLP)*. Online, Nov. 2021.

Hassan Sajjad, Ahmed Abdelali, Nadir Durrani, and Fahim Dalvi. "AraBench: Benchmarking Dialectal Arabic-English Machine Translation". In: *Proceedings of the 28th International Conference on Computational Linguistics (COLING)*. (link). Online, Dec. 2020.

Reem Suwaileh, Muhammad Imran, Tamer Elsayed, and **Hassan Sajjad**. "Are We Ready for this Disaster? Towards Location Mention Recognition from Crisis Tweets". In: *Proceedings of the 28th International Conference on Computational Linguistics (COLING)*. (link). Online, Dec. 2020.

Fahim Dalvi, **Hassan Sajjad**, Nadir Durrani, and Yonatan Belinkov. "Analyzing Redundancy in Pretrained Transformer Models". In: *Proceedings of the Conference on Empirical Methods in Natural Language Processing (EMNLP)*. (link). Online, Nov. 2020.

Nadir Durrani, **Hassan Sajjad**, Fahim Dalvi, and Yonatan Belinkov. "Analyzing Individual Neurons in Pretrained Language Models". In: *Proceedings of the Conference on Empirical Methods in Natural Language Processing (EMNLP)*. links. Online, Nov. 2020.

John Wu, Yonatan Belinkov, **Hassan Sajjad**, Nadir Durrani, Fahim Dalvi, and James Glass. "Similarity Analysis of Contextual Word Representation Models". In: *Proceedings of the Annual Conference of the Association for Computational Linguistics (ACL)*. (link). US, June 2020.

Nadir Durrani, Fahim Dalvi, **Hassan Sajjad**, Yonatan Belinkov, and Preslav Nakov. "One Size Does Not Fit All: Comparing NMT Representations of Different Granularities". In: *Proceedings of the Annual Conference of the North American Chapter of the Association for Computational Linguistics: Human Language Technologies (NAACL*). (link). Minneapolis, US, June 2019.

Hamdy Mubarak, Ahmed Abdelali, **Hassan Sajjad**, Younes Samih, and Kareem Darwish. "Highly Effective Arabic Diacritization using Sequence to Sequence Modeling". In: *Proceedings of the Annual Conference of the North American Chapter of the Association for Computational Linguistics: Human Language Technologies (NAACL*). (link). Minneapolis, US, June 2019.

D. Anthony Bau*, Yonatan Belinkov*, **Hassan Sajjad**, Fahim Dalvi, Nadir Durrani, and James Glass. "Identifying and Controlling Important Neurons in Neural Machine Translation". In: *International Conference on Learning Representations (ICLR)*. (link). New Orleans, US, May 2019.

Fahim Dalvi*, Nadir Durrani*, **Hassan Sajjad***, Yonatan Belinkov, D. Anthony Bau, and James Glass. "What is one Grain of Sand in the Desert? Analyzing Individual Neurons in Deep NLP Models". In: *Proceedings of the AAAI Conference on Artificial Intelligence (AAAI)*. (link). Honolulu, US, Mar. 2019.

Fahim Dalvi, Nadir Durrani, **Hassan Sajjad**, and Stephan Vogel. "Incremental Decoding and Training Methods for Simultaneous Translation in Neural Machine Translation". In: *Proceedings of the 16th Annual Conference of the North American Chapter of the Association for Computational Linguistics: Human Language Technologies (NAACL).* (link). New Orleans, US, June 2018.

Yonatan Belinkov, Nadir Durrani, Fahim Dalvi, **Hassan Sajjad**, and James Glass. "What do Neural Machine Translation Models Learn about Morphology?" In: *Proceedings of the 55th Conference of the Association for Computational Linguistics (ACL)*. (link). Vancouver, Canada, Aug. 2017.

Hassan Sajjad, Fahim Dalvi, Nadir Durrani, Ahmed Abdelali, Yonatan Belinkov, and Stephan Vogel. "Challenging Language-Dependent Segmentation for Arabic: An Application to Machine Translation and Part-of-Speech Tagging". In: *Proceedings of the 55th Conference of the Association for Computational Linguistics (ACL)*. (link). Vancouver, Canada, Aug. 2017.

Dat Tien Nguyen, Kamla Al-Mannai, Shafiq Joty, **Hassan Sajjad**, Muhammad Imran, and Prasenjit Mitra. "Robust Classification of Crisis-Related Data on Social Networks using Convolutional Neural Networks". In: *Proceedings of the 11th International AAAI Conference on Web and Social Media (ICWSM)*. (link). Montreal, Canada, May 2017.

Yonatan Belinkov, Lluís Màrquez, **Hassan Sajjad**, Nadir Durrani, Fahim Dalvi, and James Glass. "Evaluating Layers of Representation in Neural Machine Translation on Part-of-Speech and Semantic Tagging Tasks". In: *Proceedings of the 8th International Joint Conference on Natural Language Processing (IJCNLP)*. (link). Taipei, Taiwan, Nov. 2017.

Fahim Dalvi, Nadir Durrani, **Hassan Sajjad**, Yonatan Belinkov, and Stephan Vogel. "Understanding and Improving Morphological Learning in the Neural Machine Translation Decoder". In: *Proceedings of the 8th International Joint Conference on Natural Language Processing (IJCNLP)*. (link). Taipei, Taiwan, Nov. 2017.

Hassan Sajjad et al. "Eyes Don't Lie: Predicting Machine Translation Quality Using Eye Movement." In: *Proceedings of the 15th Annual Conference of the North American Chapter of the Association of Computational Linguistics: Human Language Technologies (NAACL-HLT).* (link). San Diego, US, June 2016.

Nadir Durrani, **Hassan Sajjad**, Shafiq Joty, and Ahmed Abdelali. "A Deep Fusion Model for Domain Adaptation in Phrase-based MT". In: *Proceedings of the 26th International Conference on Computational Linguistics (COLING)*. (link). Osaka, Japan, Dec. 2016.

Hassan Sajjad, Francisco Guzmán, and Stephan Vogel. "An Empirical Study: Post-editing Effort for English to Arabic Hybrid Machine Translation". In: *Proceedings of the Association for Machine Translation in the Americas (AMTA)*. (link). Austin, US, Oct. 2016.

Shafiq Joty, **Hassan Sajjad**, Nadir Durrani, Kamla Al-Mannai, Ahmed Abdelali, and Stephan Vogel. "How to Avoid Unwanted Pregnancies: Domain Adaptation using Neural Network Models". In: *Proceedings of the Conference on Empirical Methods in Natural Language Processing (EMNLP)*. (link). Lisbon, Portugal, Sept. 2015.

Abdul Rafae, Abdul Qayyum, Muhammad Moeen Uddin, Asim Karim, **Hassan Sajjad**, and Faisal Kamiran. "An Unsupervised Method for Discovering Lexical Variations in Roman Urdu Informal Text." In: *Proceedings of the Conference on Empirical Methods in Natural Language Processing (EMNLP)*. (link). Lisbon, Portugal, Sept. 2015.

Walid Magdy, **Hassan Sajjad**, Tarek El-Ganainy, and Fabrizio Sebastiani. "Distant Supervision for Tweet Classification Using YouTube Labels". In: *Proceedings of the Ninth International AAAI Conference on Web and Social Media (ICWSM)*. (link). Oxford, UK, May 2015.

Nadir Durrani, **Hassan Sajjad**, Shafiq Joty, Ahmed Abdelali, and Stephan Vogel. "Using Joint Models for Domain Adaptation in Statistical Machine Translation". In: *Proceedings of the 15th Machine Translation Summit (MT Summit XV)*. (link). Florida, USA, Nov. 2015.

Ahmed Abdelali, Francisco Guzman, **Hassan Sajjad**, and Stephan Vogel. "The AMARA Corpus: Building Parallel Language Resources for the Educational Domain". In: *Proceedings of the 9th International Conference on Language Resources and Evaluation (LREC)*. (link). Reykjavik, Iceland, May 2014.

Mohammad Moeen Uddin, Mohammad Imran, and **Hassan Sajjad**. "Understanding Types of Users on Twitter". In: *Proceedings of the 6th ASE International Conference in Social Computing (SocialCom)*. (link). Stanford, USA, May 2014.

Nadir Durrani, **Hassan Sajjad**, Hieu Hoang, and Philipp Koehn. "Integrating an Unsupervised Transliteration Model into Statistical Machine Translation". In: *Proceedings of the 15th Conference of the European Chapter of the ACL (EACL)*. (link). Gothenburg, Sweden, Apr. 2014.

Kareem Darwish, **Hassan Sajjad**, and Hamdy Mubarak. "Verifiably Effective Arabic Dialect Identification." In: *Proceedings of the Conference on Empirical Methods in Natural Language Processing (EMNLP)*. (link). Doha, Qatar, Oct. 2014.

Hassan Sajjad, Kareem Darwish, and Yonatan Belinkov. "Translating Dialectal Arabic to English". In: *Proceedings of the 51st Conference of the Association for Computational Linguistics (ACL)*. (link). Sofia, Bulgaria, Aug. 2013.

Hassan Sajjad, Alexander Fraser, and Helmut Schmid. "A Statistical Model for Unsupervised and Semi-supervised Transliteration Mining". In: *Proceedings of the 50th Conference of the Association for Computational Linguistics (ACL)*. (link). Jeju, Korea, July 2012.

Hassan Sajjad, Patrick Pantel, and Michael Gamon. "Underspecified Query Refinement via Natural Language Question Generation". In: *Proceedings of the 24th International Conference on Computational Linguistics (COLING)*. (link). Mumbai, India, Dec. 2012.

Hassan Sajjad, Alexander Fraser, and Helmut Schmid. "An Algorithm for Unsupervised Transliteration Mining with an Application to Word Alignment". In: *Proceedings of the 49th Conference of the Association for Computational Linguistics: Human Language Technologies (ACL-HLT)*. (link). Portland, OR, USA, June 2011

Hassan Sajjad, Nadir Durrani, Helmut Schmid, and Alexander Fraser. "Comparing Two Techniques for Learning Transliteration Models Using a Parallel Corpus". In: *Proceedings of 5th International Joint Conference on Natural Language Processing (IJCNLP)*. (link). Chiang Mai, Thailand, Nov. 2011.

Nadir Durrani, **Hassan Sajjad**, Alexander Fraser, and Helmut Schmid. "Hindi-to-Urdu Machine Translation through Transliteration". In: *Proceedings of the 48th Annual Meeting of the Association for Computational Linguistics (ACL)*. (link). Uppsala, Sweden, July 2010.

Hassan Sajjad and Helmut Schmid. "Tagging Urdu Text with Parts of Speech: A Tagger Comparison". In: *Proceedings of the 12th Conference of the European Chapter of the Association for Computational Linguistics (EACL)*. (link). Athens, Greece, Apr. 2009.

Peer-reviewed Demo Conference Papers

Fahim Dalvi, **Hassan Sajjad**, and Nadir Durrani. "NeuroX Library for Neuron Analysis of Deep NLP Models". In: *Proceedings of the Association for Computational Linguistics (ACL)*. Toronto, Canada, July 2023.

Fahim Dalvi, Nadir Durrani, **Hassan Sajjad**, Tamim Jaban, Mus'ab Husaini, and Ummar Abbas. "NxPlain: A Web-based Tool for Discovery of Latent Concepts". In: *Proceedings of the European Chapter of the Association for Computational Linguistics (EACL)*. Dubrovnik, Croatia, May 2023.

Firoj Alam, Fahim Dalvi, Nadir Durrani, **Hassan Sajjad**, Abdul Rafae Khan, and Jia Xu. "ConceptX: A Framework for Latent Concept Analysis". In: *AAAI Conference on Artificial Intelligence (AAAI)*. (link). Washington DC, USA, Feb. 2023.

Hamdy Mubarak, Ahmed Abdelali, Kareem Darwish, Mohamed Eldesouki, Younes Samih, and **Hassan Sajjad**. "A System for Diacritizing Four Varieties of Arabic". In: *In Proceedings of the Empirical Methods in Natural Language Processing (EMNLP)*. (link). Hong Kong, China, Nov. 2019.

Fahim Dalvi et al. "NeuroX: A Toolkit for Analyzing Individual Neurons in Neural Networks". In: *AAAI Conference on Artificial Intelligence (AAAI)*. (link). Honolulu, USA, Jan. 2019.

Fahim Dalvi et al. "QCRI Live Speech Translation System". In: In Proceedings of the 15th Conference of the European Chapter of the Association for Computational Linguistics (EACL). (link). Valencia, Spain, Apr. 2017.

Renars Liepins et al. "The SUMMA Platform Prototype". In: *Proceedings of the 15th Conference of the European Chapter of the Association for Computational Linguistics (EACL)*. (link). Valencia, Spain, Apr. 2017.

Peer-reviewed Workshop Papers

Ahmed Abdelali, Nadir Durrani, Fahim Dalvi, and **Hassan Sajjad**. "Post-hoc analysis of Arabic transformer models". In: *Proceedings of the BlackboxNLP Workshop on Analyzing and Interpreting Neural Networks for NLP*. (link). Abu Dhabi, Nov. 2022.

Hassan Sajjad, Nadir Durrani, Fahim Dalvi, Yonatan Belinkov, and Stephan Vogel. "Neural Machine Translation Training in a Multi-Domain Scenario". In: *Proceedings of the 14th International Workshop on Spoken Language Translation (IWSLT)*. (link). Tokyo, Japan, Dec. 2017.

Dat Tien Nguyen, Shafiq Joty, Muhammad Imran, **Hassan Sajjad**, and Prasenjit Mitra. "Applications of Online Deep Learning for Crisis Response Using Social Media Information". In: *Proceedings of the 4th International Workshop on Social Web for Disaster Management (SWDM)*. (link). Indianapolis, US, Oct. 2016.

Wajdi Zaghouani, Ahmed Abdelali, Francisco Guzmán, and **Hassan Sajjad**. "Normalizing Mathematical Expressions to Improve the Translation of Educational Content". In: *Proceedings of the AMTA 2016 Workshop Semitic Machine Translation (SeMaT)*. (link). Austin, US, Oct. 2016.

Francisco Guzmán, Ahmed Abdelali, Irina Temnikova, **Hassan Sajjad**, and Stephan Vogel. "How do Humans Evaluate Machine Translation". In: *Proceedings of the Workshop on Machine Translation (WMT)*. (link). Lisbon, Portugal, Sept. 2015.

Kamla Al-Mannai, **Hassan Sajjad**, Alaa Khader, Fahad Al Obaidli, Preslav Nakov, and Stephan Vogel. "Unsupervised word segmentation improves dialectal Arabic to English machine translation". In: *Proceedings of the Workshop of Arabic Natural Language Processing (ANLP)*. (link). Doha, Qatar, Oct. 2014.

Francisco Guzmán, **Hassan Sajjad**, Stephan Vogel, and Ahmed Abdelali. "The AMARA Corpus: Building Resources for Translating the Web's Educational Content". In: *Proceedings of the 10th International Workshop on Spoken Language Technology (IWSLT)*. (link). Heidelberg, Germany, Dec. 2013.

Shared-task Workshop Papers

Lucia Specia et al. "Findings of the WMT 2020 Shared Task on Machine Translation Robustness". In: *Proceedings of the Conference on Machine Translation (WMT), Shared Task Papers.* Online, Nov. 2020.

Xian Li et al. "Findings of the First Shared Task on Machine Translation Robustness". In: *Proceedings of the Fourth Conference on Machine Translation (WMT), Volume 2: Shared Task Papers.* (link). Florence, Italy, Aug. 2019.

Houda Bouamor and **Hassan Sajjad**. "H2@BUCC18: Parallel Sentence Extraction from Comparable Corpora Using Multilingual Sentence Embeddings". In: *Proceedings of the 11th Workshop on Building and Using Comparable Corpora (BUCC)*. (link). Miyzaki, Japan, May 2018.

Nadir Durrani, Fahim Dalvi, **Hassan Sajjad**, and Stephan Vogel. "QCRI's Machine Translation Systems for IWSLT'2016". In: *Proceedings of the 13th International Workshop on Spoken Language Translation (IWSLT)*. (link). Seattle, USA, Dec. 2016.

Mohamed Eldesouki, Fahim Dalvi, **Hassan Sajjad**, and Kareem Darwish. "QCRI @ DSL 2016: Spoken Arabic Dialect Identification Using Textual". In: *Proceedings of the 3rd Workshop on NLP for Similar Languages, Varieties and Dialects.* (link). Osaka, Japan, Dec. 2016.

Houda Bouamor, **Hassan Sajjad**, Nadir Durrani, and Kemal Oflazer. "QCMUQ@QALB-2015 Shared Task: Combining Character level MT and Error-tolerant Finite-State Recognition for Arabic Spelling Correction". In: *Proceedings of the Workshop of Arabic Natural Language Processing (ANLP)*. (link). Beijing, China, July 2015.

Hassan Sajjad et al. "QCN Egyptian Arabic to English Machine Translation System for NIST OpenMT15". In: *Workshop of NIST OpenMT15*. (link). Washington DC, US, June 2015.

Nadir Durrani, Helmut Schmid, Alexander Fraser, **Hassan Sajjad**, and Richárd Farkas. "Munich-Edinburgh-Stuttgart Submissions of OSM Systems at WMT13". In: *Proceedings of the Eighth Workshop on Statistical Machine Translation (WMT)*. (link). Sofia, Bulgaria, Aug. 2013.

Hassan Sajjad, Svetlana Smekalova, Nadir Durrani, Alexander Fraser, and Helmut Schmid. "QCRI-MES Submission at WMT13: Using Transliteration Mining to Improve Statistical Machine Translation". In: *Proceedings of the Eighth Workshop on Statistical Machine Translation (WMT)*. (link). Sofia, Bulgaria, Aug. 2013.

Marion Weller et al. "Munich-Edinburgh-Stuttgart Submissions at WMT13: Morphological and Syntactic Processing for SMT". In: *Proceedings of the Eighth Workshop on Statistical Machine Translation (WMT)*. (link). Sofia, Bulgaria, Aug. 2013.

Hassan Sajjad et al. "QCRI at IWSLT 2013: Experiments in Arabic-English and English-Arabic Spoken Language Translation". In: *Proceedings of the 10th International Workshop on Spoken Language Technology (IWSLT)*. (link). Heidelberg, Germany, Dec. 2013.

Tutorials

 Hassan Sajjad, Narine Kokhlikyan, Fahim Dalvi and Nadir Durrani, "Fine-grained Interpretation and Causation Analysis in Deep NLP Models". In Proceedings of the North American Chapter of the Association of Computational Linguistics: Human Language Technologies (NAACL-HLT), June 2021.

Teaching Experience

NLP with Deep Learning

Canada

Dalhousie University

Winter 2023, 2024

CSCI 1108 - Experimental Robotics

Canada

Dalhousie University

Fall 2022, Winter 2023, 2024

NLP with Python

Qatar

Carnegie Mellon University in Qatar

19-30th Oct. 2020

As part of the NLP with Python course, delivered 6 hours lectures covering the fundamentals of deep learning with practical exercises

Deep Learning for NLP

Germany

University of Duisburg-Essen

9-13th Sept. 2019

15 hours course covering the fundamentals of deep learning from intuition to practical exercises

Deep Learning for NLP

Sri Lanka

International Spring School, University of Moratuwa

16-21st Mar. 2019

15 hours course on the basics of deep learning with hands-on exercises involving several NLP tasks

From Theory to Practice: Deep Learning for NLP

Germany

University of Duisburg-Essen

8-14th Apr. 2018

15 hours course covering theory of deep learning models from intuition to practical exercises in Keras (content)

Deep Learning for Machine Translation

Germany

9th Computational linguistics fall school, DGfS

11-22nd Sept. 2017

15 hours course teaching fundamentals of deep learning and its application to machine translation (content)

Probability and Statistics

Pakistan

National University of Computer and Emerging Sciences

Sept. 2004-Dec. 2004

Teaching assistant

Pakistan

National University of Computer and Emerging Sciences

Feb. 2003-Jun. 2003

Teaching assistant

Introduction to Natural Language Processing

Pakistan

ADDO AI

Calculus

Nov. 2019-Jan. 2020

Course content design and delivery advisor

Patent

- Latent concept analysis method, US Patent US20230325426
- Search system with query refinement, US Patent 9,767,144
- Method and system for diacritizing Arabic text, US Patent App. 17/598,633

Grants

- Personalized User Engagement based on Activity Insights, MITACS, CAD 30,000 (2024)
- Interpreting Deep Learning Models of Natural Language Processing, Research Nova Scotia, CAD 148,553 (2023)
- Interpreting Deep Learning Models of Natural Language Processing, CFI JELF, CAD 148,553 (2022)
- Fine-grained Interpretation of Deep Neural Network Models of NLP, NSERC Discovery Grant, CAD 145,000 (2022-2027)
- Customized Machine Translation, Accelerator program at Qatar Science and Technology Park, USD 100,000 (2016)

Research Competitions

- Workshop on Building and using Comparable Corpora (2018), French-English parallel corpus extraction
- **Best system** International Workshop on Spoken Language Technology (2016), Arabic-English translation task
- **Second best system and best system description paper** NIST Open Machine Translation Evaluation Workshop (2015), Egyptian Arabic to English translation task
- **Second best system** Shared Task on Automatic Arabic Error Correction (2015)
- Best system International Workshop on Spoken Language Technology (2013), Arabic-English translation task
- **Second best constrained system** Eighth Workshop on Statistical Machine Translation (2013), English-Russian translation task

Open Source Contributions

- NeuroX Interpretation and manipulation of deep models (alpha version: link)
- LayerDrop for efficient transfer learning using pre-trained models (integrated into a fork of the huggingface transformer library, link) (paper)
- Transliteration Mining Tool (link)
- Linguistic Resources
 - AraBench Dialect Arabic to English evaluation suite (link)
 - The QCRI Educational Domain corpus a collection of parallel corpora of the education domain in multiple languages (link)
 - English-Hindi and English-Arabic gold set for transliteration mining evaluation (link)
 - Most widely-used part of speech tagset of Urdu and annotated corpus of 100,000 words

Honors and Awards

- Panellist on discussing Data Centric AI for Reliable Models at the 9th workshop on representation learning for NLP at ACL 2024 (Aug. 2024)
- Media coverage: pioneer dialectal Arabic translation Gulf Times, MENAFN, HBKU (Aug. 2020)
- Outstanding reviewer at the EMNLP 2020 conference

- Machine translation technology deployed to BBC and Deutsche Welle as part of the SUMMA project (2019) and tech transfer to KanariAl (June 2020),
- Media coverage: 1 billion tokens translated by our machine translation system (Aug. 2020). (link1), (link2)
- Panellist on discussing NLP Research In Pakistan: Building Synergies and Collaborations at 7th International Conference on Language and Technology (Feb. 2020). (link)
- Media coverage: MIT News covers our work on analyzing and controlling deep models (Feb. 2019) (link)
- Best Innovation Award at the Annual Research Conference 2018, Qatar for our speech translation system (link)
- Media coverage: MIT News covers our work on analyzing representations in deep models (Dec. 2017) (link)
- Qatar Science and Technology Park speed pitching (Nov. 2015) selected among the top 3 teams out of 26 teams
- Second position in the Qatar Annual Research Conference 2014 for a student research project
- Google sponsorship for participation in the Second Lisbon Machine Learning School
- Full PhD merit-based scholarship from HEC-DAAD for doctoral studies in Germany (4 years)
- Four year scholarship for the bachelors program

Talks and Keynotes

- Latent Space Exploration for Safe and Trustworthy Al Models. MBZUAI, Abu Dhabi (Aug. 2024)
- Latent Space Exploration for Safe and Trustworthy Al Models. Representation learning for NLP at ACL (Aug. 2024) (**Keynote**)
- Latent Space Exploration for Safe and Trustworthy Al Models. Al@Thomson Reuters (Apr. 2024)
- Neuron Interpretation of Deep NLP Models. ITU, Lahore, Pakistan (Dec. 2023)
- Latent Concept based Explanation of Deep Learning Models. MBZUAI, Abu Dhabi (Nov. 2023)
- Latent Concepts in Transformer Models of NLP. UKP, TU Darmstadt, Germany (Jun. 2023)
- Knowledge Manifolds in Transformer Models of NLP. National Research Council (NRC), Canada (Apr. 2023)
- Knowledge Manifolds in Transformer Models of NLP. TAMALE seminar, University of Ottawa, Canada (Apr. 2023)
- Analyzing Latent Concepts in Deep Neural Network Models of NLP. STCI Microsoft, India (Jun. 2022)
- Analyzing Latent Concepts in Deep Neural Network Models of NLP. Data Science Institute, National University of Ireland Galway, (Jun. 2022)
- Exploiting Redundancy in Pre-trained Models for Efficient Transfer Learning. Machine Learning and Data Analytics Symposium, Qatar (Mar. 2021) (Invited talk)
- Exploiting Redundancy in Pre-trained Models for Efficient Transfer Learning. Facebook, US (Feb. 2021)
- Exploiting Redundancy in Pre-trained Models for Efficient Transfer Learning. National Research Council (NRC), Canada (Nov. 2020)
- Hidden Linguistics in Deep NLP Models. Heinrich-Heine Universität Düsseldorf, Germany (Oct. 2020)

- Interpreting Deep NLP Models. University of Edinburgh, UK (Apr. 2020)
- Interpreting Deep NLP Models. University of Sheffield, UK (Mar. 2020)
- Efficient Transfer Learning of Pre-trained Model. 7th International Conference on Language and Technology (link), UET, Pakistan (Feb. 2020) (**Keynote**)
- Interpreting Deep NLP Models: A Case Study on Neural MT at Google, US (Apr. 2019)
- Interpreting Deep NLP Models: A Case Study on Neural MT at Salesforce, US (Apr. 2019)
- Interpreting Deep NLP Models: A Case Study on Neural MT at Bosch, US (Apr. 2019)
- Interpreting Deep NLP Models: A Case Study on Neural MT at Facebook, US (Apr. 2019)
- Interpreting Deep NLP Models: A Case Study on Neural MT at Amazon, US (Apr. 2019)
- Hidden Linguistics in Deep NLP Models. Symposium on Natural Language Processing. University of Moratuwa, Sri Lanka (Mar. 2019) (**Keynote**)
- Machine Translation in the Real World. King's College London, UK (Mar. 2019)
- Analyzing Individual Neurons in Deep NLP Models. University of Melbourne, Melbourne, Australia (Feb. 2019)
- Analyzing Individual Neurons in Deep NLP Models. Thomson Reuters, Toronto, Canada (Feb. 2019)
- What do Neural Machine Translation Models Learn about Morphology. Macquarie University, Sydney, Australia (Apr. 2017)
- What do Neural Machine Translation Models Learn about Morphology. University of Sydney, Sydney, Australia (Apr. 2017)
- From Phrase-based to Neural Machine Translation. Workshop on Semitic Machine Translation, AMTA, Austin, US (Nov. 2016) (**Keynote**)
- Deep Learning Neural Machine Translation. Sixth Conference on Language and Technology (CLT16), Lahore, Pakistan (Nov. 2016) (**Keynote**)
- Content Model Applications for Promoting Local Language Content. Workshop on Facilitating Local Language Content Access and Generation using Human Language Technologies, UET, Lahore, Pakistan (Aug. 2015) (**Keynote**)
- Statistical Machine Translation for Community Service: Translating Educational Content. Fifth Conference on Language and Technology (CLT14), Karachi, Pakistan (Nov. 2014) (**Keynote**)
- Separating Transliterations from Translations in Transliteration Mining Context. FBK, Trento, Italy (Oct. 2012)
- Unsupervised Transliteration Mining. School of Science and Engineering, Lahore University of Management and Sciences, Pakistan (Apr. 2012)
- Unsupervised Transliteration Mining, Punjab University College of Information Technology, Pakistan (Apr. 2012)

Professional Services

- Tutorial chair: EMNLP 2023
- Workshop/shared task organization: MT robustness 2019/20 (WMT), BlackBoxNLP 2020/21 (EMNLP)
- Area chair: NeurIPS 2023/24, ARR 042024/062024/082024, NAACL 2024/22/21, EMNLP

- 2023/24/21 (NLG track), AACL 2022 (Interpretability track), ACL 2020 (NLP applications)
- Senior PC: ACL 2022, AAAI 2021/22
- Conference reviewer: regular reviewer at ACL/EMNLP/NAACL/EACL/COLING
- Conference reviewer: ICML 2021/22/23, NeurIPS 2020/21, ICLR 2020/21/22/23, AAAI 2019/20, CONLL 2021, IJCAI 2018/19, EAMT 2017
- Workshop reviewer: IWSLT, WANLP, Blackbox NLP 2022, Rep4NLP 2024
- Journal reviewer: TACL, JAIR, ML, NLE, LRE, CSL, PAMI, PLOS-ONE, IEEE TNNLS
- Journal review editor: Language and computation
- Penalist at the Halifax Innovation Challenge, Canada (13-14th Oct. 2023)
- Challenge22: proposal reviewer for phase 1 and phase 2 (2017)
- Judge at the annual Hackathon at Carnegie Mellon University Qatar (27-28th Jan. 2017)
- Judge at the first Alice Competition at Carnegie Mellon University Qatar (23rd May 2016)

Advising

- Ph.D. advisor (2023 -): Hammad Rizwan
- Ph.D. advisor (2022 -): Xuemin Yu
- Ph.D. advisor (2022 -): Sher Badshah
- Ph.D. co-advisor with Frank Rudzicz (2023 -): Domenic Rosati
- Ph.D. co-advisor with Alberto Barrón-Cedeño (2023 –): Paolo Gajo
- Ph.D. co-advisor with Laura Kallmeyer (2023 –): David Arps
- Ph.D. co-advisor with Evangelos Milios (2022 –): Jinkun Chen
- MCS advisor (2023–24): Manpreet Singh
- BCS Thesis advisor (2023): Hassaan Asif
- BCS internship (2022–23): Neelam Uppal
- BCS Thesis advisor (2023): Megan Cao (joined masters at the University of Toronto)

External PhD/MS Committee

- Ph.D.: Out-of-distribution Robustness. Yu Yu. Stevens Institute of Technology, NJ, US. Nov 2022
- MCS: Human-in-the-loop Classification for Multi-page Administrative Documents, Rakshit Makan.
 Dalhousie University, Canada. Dec 2022
- MCS: Multi-Modal Consensus Clustering to Identify Kidney Transplant Donor and Recipient Phenotypes, Kranthi Kiran Jalakam. Dalhousie University, Canada. Nov 2022
- Ph.D.: Jamal Abdul Nasir. Lahore University of Management Sciences, Pakistan. 2014

Masters and Bachelor Advising

- Laura Lehmann, LMU Munich, Germany (External examiner of Bachelor thesis titled MulTraLit: a multilingual transliteration system). 2020
- Kamela Ali Al Mannai, HBKU, Qatar (External advisor, Master thesis on Dialect Identification), 2018
- Abdul Rafae, LUMS, Pakistan (External advisor, later did PhD from the Hunter College City University, New York)

Research Internship

- Sherin Rasheed Aug 2021 Feb 2022
- Kamran Janjua Jan Aug 2021 (now a master student at the University of Alberta, Canada)
- Fahim Dalvi 2013 (graduated from Stanford University, now working at QCRI)
- Dat Tien Nguyen (now a PhD student at the University of Amsterdam)
- Kamela Ali Al Mannai (now a PhD student at Hamad Bin Khalifa University, Qatar)
- Alaa Khader (now a research coordinator at NASA BHP, US)

Participations

- Deep Learning for Machine Translation, Winter School, Dublin, Ireland (18-24th Oct. 2015)
- Dagstuhl Seminar on Statistical Techniques for Translating to Morphologically Rich Languages (2-7th Feb. 2014)
- Taming the social web, 2nd Lisbon Machine Learning School (19-25th Jul. 2012)
- 5th MT Marathon, Le Mans France (13-17 Sept. 2010). Worked with Adam Lopez on Minimum Risk Decoding in Cdec
- Summer School in Asian Language Processing (Jun.-Aug. 2006)