# Nikolaos Pappas

# Contact information

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# Employment history

- 2.2022-Present Amazon Web Services, Senior Applied Scientist, AWS AI HLT group, Seattle, USA.
- 7.2021–2.2022 Amazon Web Services, Applied Scientist, AWS AI HLT group, Seattle, USA.
- 9.2019-7.2021 University of Washington, Postdoctoral Researcher, Noah's ARK NLP group, Seattle, USA.
- 4.2016-8.2019 Idiap Research Institute, Postdoctoral Researcher, NLP group, Martigny, Switzerland.
- 2.2012-3.2016 EPFL & Idiap Research Institute, Research Assistant, NLP group, Martigny, Switzerland.
- 7.2014-12.2014 Columbia University, Visiting Scholar, DVMM lab, New York, USA.
- 5.2009-10.2011 I-Sieve Technologies, Software Engineer, Athens, Greece.
- 11.2007-11.2011 Endysis Group, Software Engineer, Athens, Greece.
  - 3.2007-7.2007 Optimor Labs, Software Developer, Oxford, England.

#### Education

- 2016 Ecole Polytechnique Fédérale de Lausanne (EPFL), Lausanne, Switzerland.
  - Ph.D. Electrical Engineering
- Thesis Learning explainable user sentiment and preferences for information filtering
- Committee Sabine Süsstrunk, Thomas Hofmann, Shih-Fu Chang, Jean-Cédric Chappelier
  - Advisor Andrei Popescu-Belis, Hervé Bourlard
    - 2011 University of the Aegean, Samos, Greece.
      - M.Sc. Information Management
    - 2009 University of the Aegean, Samos, Greece.
      - Dipl. Eng. Information and Communication Systems

# ■ Awards & Honors

- 2018 Two-year postdoc fellowship to be hosted at the University of Washington.

  Swiss National Science Foundation
- 2017 Best paper award "Multilingual Hierarchical Attention Networks for Document Classification".
  - 8th International Joint Conference on Natural Language Processing, 2017
- 2016 Best multimodal paper award "Multilingual Visual Sentiment Concept Matching".

  ACM International Conference on Multimedia Retrieval, 2016
- 2015 Best paper award "Adaptive Sentiment-aware One-Class Collaborative Filtering".

  \*Idiap Research Institute\*
- 2013 Ranked first on video hyperlinking task with Idiap's NLP group.

  MediaEval, ACM MM Conference 2013
- 2010 Award for top graduates of Greek Polytechnic Schools (2009 2010). TEE (Technical Chamber of Greece)
- 2006 Scholarship for the third academic year (ranked 1st).
  - IKY (Greek State Scholarships Foundation)
- 2004 Scholarship for the first academic year (ranked 2nd).
  - IKY (Greek State Scholarships Foundation)

### Research funding

2019 Swiss National Science Foundation, 2 years, Applicant, Switzerland.

UNISON, http://p3.snf.ch/project-183911.

Swiss National Science Foundation, 6 months, Member, Switzerland.

INTREPID, http://p3.snf.ch/Project-180320.

- 2018 Intelligence Advanced Research Projects Activity (IARPA), 3 months, Member, USA. MATERIAL, http://summa-project.eu/.
- 2016 European Union (Horizon 2020), 3 years, Member, Switzerland. SUMMA, http://summa-project.eu/.
- 2015 **TheArk Foundation**, 6 months, Member, Switzerland. HYBRID, https://www.theark.ch/en/.
- 2014 Swiss National Science Foundation, 1 month, Member, Switzerland. AROLES, http://p3.snf.ch/Project-144627.
- 2012 European Union (FP7-ICT), 4 years, Member, Switzerland. InEvent, https://www.inevent-project.eu/.

# Teaching

#### Ecole Polytechnique Fédérale de Lausanne (EPFL)

- 2016 EE-724 Human Language Technology: Applications to Information Access 4 guest lectures.
- 2012 EE-724 Human Language Technology: Applications to Information Access 1 guest lecture.

# Mentoring

### University of Washington

2020 Daniel Zhu – UW CSE BS student, 01/2021 – 07/2021.

Stephen Wu – UW CSE BS student, 02/2019 - 07/2021.

Sean Hung – UW CSE BS student, 10/2020 – 12/2020.

2019 Xuhui Zhou – UW CLMS MS student, 10/2019 - 06/2020. Ivan Montero – UW CSE BS student, 10/2019 - 07/2021.

Ecole Polytechnique Fédérale de Lausanne (EPFL)

2017 Khalil Mrini – EPFL CS MS student, 03/2017 - 09/2017. Jonathan Pilault – Idiap intern, 03/2017 - 09/2017.

#### Academic Service

NLP EMNLP, Conference on Empirical Methods on Natural Language Processing, 2017-2021.

ACL, Annual Meeting of the Association for Computational Linguistics, 2017, 2019-2022.

**NAACL-HLT**, Annual Conference of the North American Chapter of the Association for Computational Linguistics, 2018-2021.

**AACL-IJCNLP**, Conference of the Asia-Pacific Chapter of the Association for Computational Linguistics and the 9th International Joint Conference on Natural Language Processing, 2020.

ACL RR, Association for Computational Linguistics Rolling Review, 2021-Present.

**TACL**, Transactions of the Association for Computational Linguistics, 2021.

COLING, International Conference on Computational Linguistics, 2016,2020.

LREC, Language Resources and Evaluation Conference, 2018,2020.

ML/Other ICML, International Conference on Machine Learning, 2020-2021.

ICLR, International Conference on Learning Representations, 2021-2022.

NeurIPS, Conference on Neural Information Processing Systems, 2021.

AAAI, Conference on Artificial Intelligence, 2020-2022.

IJCAI, International Joint Conference on Artificial Intelligence, 2021.

ICMR, International Conference on Multimedia Retrieval, 2017-2019.

MM, ACM Multimedia, 2017-2018.

#### Talks & Lectures

- 2021 Large-context and efficient models of language Pindrop, Online.
- 2020 Grounded Compositional Outputs for Adaptive Language Modeling EMNLP conference, Online.
- 2019 Deep Residual Output Layers for Neural Language Generation ICML Conference, Long Beach, CA, USA.
- 2018 Basics and Modern Methods for Natural Language Processing UnternehmerTUM, Munich, Germany.
- 2017 Multilingual Hierarchical Attention Networks for Document Classification IJCNLP conference, Tapei, Taiwan.

Labeling Text in Several Languages with Multilingual Hierarchical Attention Networks, Swisstext, Zurich, Switzerland.

2016 Deep Learning for NLP: Multilingual Word Sequence Modeling EE-724 EPFL, Lausanne, Switzerland.

Human versus Machine Attention in Document Classification: A Dataset with Crowdsourced Annotation, EMNLP conference, Austin, Texas.

Deep Learning for NLP: Word Representation Learning

EE-724 EPFL, Lausanne, Switzerland.

Explicit Document Modeling using Multiple-Instance Learning

Data Science group at Swisscom, Lausanne, Switzerland.

Labeling Text in Several Languages with Multilingual Hierarchical Attention Networks, Swisstext, Zurich, Switzerland.

- 2015 Weighted Multiple Instance Learning for Text Regression Tasks Swiss Machine Learning Days, Lausanne Switzerland.
- 2013 Learning Aspects and Ratings with Multiple-Instance Regression from Text Swiss Machine Learning Days, Lausanne Switzerland.

Combining Content with User Preferences for TED Lecture Recommendation CBMI conference, Veszprém, Hungary.

2012 Intoduction to Recommender Systems

EE-724 EPFL, Lausanne, Switzerland.

# Journal publications

#### Resulting from Postdoctoral time

- 2019 [6] Nikolaos Pappas, James Henderson, "GILE: A Generalized Input-Label Embedding for Text Classification", In *Transactions of the Association for Computational Linguistics* (TACL), 2019. URL https://arxiv.org/pdf/1806.06219.pdf.
- 2018 [5] Xiao Pu, Nikolaos Pappas, James Henderson, Andrei Popescu-Belis, "Integrating Weakly Supervised Word Disambiguation into Neural Machine Translation", In *Transactions of the Association for Computational Linguistics* (TACL), 2018. URL https://arxiv.org/pdf/1810.02614.pdf.

2017 [4] Nikolaos Pappas, Andrei Popescu-Belis, "Explicit Document Modeling through Weighted Multiple-Instance Learning", Journal of Artificial Intelligence Research (JAIR), pages 591–626, 2017. URL https://jair.org/index.php/jair/article/view/11051/26228.

#### Resulting from PhD time

- 2017 [3] Nikolaos Pappas, Mercan Topkara, Miriam Redi, Hongyi Liu, Brendan Jou, Tao Chen, Shih-Fu Chang, "Multilingual Visual Sentiment Concept Clustering and Analysis", International Journal of Multimedia Information Retrieval (IJMIR), pages 1–20, 2017. URL https://link.springer.com/article/10.1007/s13735-017-0120-4.
- 2016 [2] Nikolaos Pappas, Andrei Popescu-Belis, "Adaptive Sentiment-Aware One-Class Collaborative Filtering", Expert Systems with Applications (ESWA), 43(1): 23-41, 2016. URL https://www.sciencedirect.com/science/article/pii/S0957417415005916.
- 2015 [1] Nikolaos Pappas, Andrei Popescu-Belis, "Combining Content with User Preferences for Non-Fiction Multimedia Recommendation: A Study on TED Lectures", Multimedia Tools and Applications, Special Issue on Content-Based Multimedia Indexing (MTAP), 74(4): 1175-1197, 2015. URL https://link.springer.com/article/10.1007/s11042-013-1840-y.

# Conference and workshop publications

#### Resulting from Postdoctoral time

- 2022 [25], Hao Peng, Jungo Kasai, Nikolaos Pappas, Dani Yogatama, Zhaofeng Wu, Lingpeng Kong, Roy Schwartz, Noah A. Smith, "ABC: Attention with Bounded-memory Control", In Proceedings of the 60th Annual Meeting of the Association for Computational Linguistics (ACL), 2022. URL https://arxiv.org/pdf/2110.02488.pdf.
- 2021 [24] Ivan Montero, Nikolaos Pappas, Noah A. Smith, "Sentence Bottleneck Autoencoders from Pretrained Transformer Models", In *Proceedings of the 2020 Conference on Empirical Methods in Natural Language Processing* (EMNLP), 2021. URL https://aclanthology.org/2021.emnlp-main.137.pdf.
  - [23] Jungo Kasai, Hao Peng, Yizhe Zhang, Dani Yogatama, Gabriel Ilharco, Nikolaos Pappas, Yi Mao, Weizhu Chen, Noah A. Smith, "Finetuning Pretrained Transformers into RNNs", In *Proceedings of the 2020 Conference on Empirical Methods in Natural Language Processing* (EMNLP), 2021. URL https://aclanthology.org/2021.emnlp-main.830.pdf.
  - [22] Hao Peng, Nikolaos Pappas, Dani Yogatama, Roy Schwartz, Noah Smith, Lingpeng Kong, "Random Feature Attention", In *Proceedings of the International Conference on Learning Representations* (ICLR), 2021. URL https://openreview.net/pdf?id=QtTKTdVrFBB.
  - [21] Jungo Kasai, Nikolaos Pappas, Hao Peng, James Cross, Noah Smith, "Deep Encoder, Shallow Decoder: Reevaluating Non-autoregressive Machine Translation", In *Proceedings of the International Conference on Learning Representations* (ICLR), 2021. URL https://openreview.net/pdf?id=KpfasTaLUpq.
- 2020 [20] Nikolaos Pappas, Phoebe Mulcaire, Noah A. Smith "Grounded Compositional Outputs for Adaptive Language Modeling", In *Proceedings of the 2020 Conference on Empirical Methods in Natural Language Processing* (EMNLP), 2020. URL https://aclanthology.org/2020.emnlp-main.96.pdf.
  - [19] Xuhui Zhou, Nikolaos Pappas, Noah A. Smith "Multilevel Text Alignment with Cross-Document attention", In *Proceedings of the 2020 Conference on Empirical Methods in Natural Language Processing* (EMNLP), 2020. URL https://aclanthology.org/2020.emnlp-main. 407.pdf.
  - [18] Florian Mai, Nikolaos Pappas, Ivan Montero, Noah A. Smith, James Henderson "Plug and Play Autoencoders for Conditional Text Generation", In *Proceedings of the 2020 Conference on Empirical Methods in Natural Language Processing* (EMNLP), 2020. URL https://aclanthology.org/2020.emnlp-main.491.pdf.

- [17] Angelos Katharopoulos, Apoorv Vyas, Nikolaos Pappas, Francois Fleuret, "Transformers are RNNs: Fast Autoregressive Transformers with Linear Attention", In *Proceedings of the 37th International Conference on Machine Learning* (ICML), Vienna, Austria, 2020. URL http://proceedings.mlr.press/v119/katharopoulos20a/katharopoulos20a.pdf.
- 2019 [16] Nikolaos Pappas, James Henderson, "Deep Residual Output Layers for Neural Language Generation", In *Proceedings of the 36th International Conference on Machine Learning* (ICML), Long Beach, California, 2019. URL http://publications.idiap.ch/downloads/papers/2019/Pappas\_ICML\_2019.pdf.
- 2018 [15] Lesly Miculicich Werlen, Dhananjay Ram, Nikolaos Pappas, James Henderson, "Document-Level Neural Machine Translation with Hierarchical Attention Networks", In *Proceedings of the 2018 Conference on Empirical Methods in Natural Language Processing* (EMNLP), Brussels, Belgium, 2018. URL http://publications.idiap.ch/downloads/papers/2018/Miculicich\_EMNLP\_2018.pdf.
  - [14] Nikolaos Pappas, Lesly Miculicich Werlen, James Henderson, "Beyond Weight Tying: Learning Joint Input-Output Embeddings for Neural Machine Translation", In *Proceedings of the 2018 Third Conference on Machine Translation* (WMT), Brussels, Belgium, 2018. URL http://publications.idiap.ch/downloads/papers/2018/Pappas\_WMT\_2018.pdf.
  - [13] Lesly Miculicich Werlen, Nikolaos Pappas, Dhananjay Ram, Andrei Popescu-Belis, "Self-attentive Residual Decoder for 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), pages 1366–1379, New Orleans, USA, 2018. URL http://aclweb.org/anthology/N18-1124.
- 2017 [12] Nikolaos Pappas, Andrei Popescu-Belis, "Multilingual Hierarchical Attention Networks for Document Classification", In 8th International Joint Conference on Natural Language Processing (IJCNLP), pages 1015–1025, Tapei, Taiwan, 2017. URL http://aclweb.org/anthology/I17-1102.
  - [11] Xiao Pu, Nikolaos Pappas, Andrei Popescu-Belis, "Sense-Aware Statistical Machine Translation using Adaptive Context-Dependent Clustering", In *Proceedings of Second Conference on Machine Translation* (WMT), pages 1–10, Copenhagen, Denmark, 2017. URL http://www.statmt.org/wmt17/pdf/WMT01.pdf.
- 2016 [10] Nikolaos Pappas, Andrei Popescu-Belis, "Human versus Machine Attention in Document Classification: A Dataset with Crowdsourced Annotations", In *Proceedings of 2016 Empirical Methods for Natural Language Processing SocialNLP Workshop* (SocialNLP), pages 94–100, Austin, USA, 2016. URL http://www.aclweb.org/anthology/W16-6213.

#### Resulting from PhD time

- 2016 [9] Nikolaos Pappas, Mercan Topkara, Miriam Redi, Brendan Jou, Tao Chen, Hongyi Liu, Shih-Fu Chang, "Multilingual Visual Sentiment Concept Matching", In Proceedings of the ACM International Conference on Multimedia Retrieval (ICMR), pages 151–158, New York, NY, USA, 2016. URL http://delivery.acm.org/10.1145/2920000/2912016/p151-pappas.pdf.
  [8] Hongyi Liu, Brendan Jou, Tao Chen, Mercan Topkara, Nikolaos Pappas, Miriam Redi, Shih-Fu Chang, "Complura: Exploring and Leveraging a Large-scale Multilingual Visual Sentiment Ontology", In Proceedings of the 2016 ACM on International Conference on Multimedia Retrieval (ICMR), pages 417–420, New York, NY, USA, 2016. URL https://dl.acm.org/citation.cfm?id=2911996.2912030.
- 2015 [7] Brendan Jou\*, Tao Chen\*, Nikolaos Pappas\*, Miriam Redi\*, Mercan Topkara\* and Shih-Fu Chang, "Visual Affect Around the World: A Large-scale Multilingual Visual Sentiment Ontology", In *Proceedings of ACM International Conference on Multimedia* (ACMMM), Brisbane, Australia, 2015. URL https://dl.acm.org/citation.cfm?doid=2733373.2806246.
- [6] Nikolaos Pappas, Andrei Popescu-Belis, "Explaining the Stars: Weighted Multiple-Instance Learning for Aspect-Based Sentiment Analysis", In *Proceedings of Conference on Empirical Methods in Natural Language Processing* (EMNLP), pages 455-466, Doha, Qatar, 2014. URL http://www.aclweb.org/anthology/D14-1052.

- [5] Chidansh A. Bhatt, Nikolaos Pappas, Maryam Habibi and Andrei Popescu-Belis, "Multimodal Reranking of Content-based Recommendations for Hyperlinking Video Snippets", In *Proceedings of ACM International Conference on Multimedia Retrieval* (ICMR), pages 225–232, Glasgow, UK, 2014. URL https://dl.acm.org/citation.cfm?id=2578752.
- 2013 [4] Nikolaos Pappas, Andrei Popescu-Belis, "Sentiment Analysis of User Comments for One-Class Collaborative Filtering over TED Talks", In Proceedings of 36th ACM SIGIR Conference on Research and Development in Information Retrieval (SIGIR), pages 773-776, Dublin, Ireland, 2013. URL https://dl.acm.org/citation.cfm?id=2484116.
  - [3] Nikolaos Pappas, Andrei Popescu-Belis, "Combining Content with User Preferences for TED Lecture Recommendation", In *Proceedings of 11th International Workshop on Content Based Multimedia Indexing* (CBMI), pages 47–52, Veszprém, Hungary, 2013. URL https://ieeexplore.ieee.org/document/6576551/.
  - [2] Chidansh A. Bhatt, Andrei Popescu-Belis, Maryam Habibi, Sandy Ingram, Stefano Masneri, Fergus McInnes, Nikolaos Pappas, Oliver Schreer, "Multi-factor Segmentation for Topic Visualization and Recommendation: the MUST-VIS System", In *Proceedings of 21st ACM International Conference on Multimedia* (ACMMM), pages 365–368, Barcelona, Spain, 2013. URL https://dl.acm.org/citation.cfm?id=2508120.
  - [1] Chidansh A. Bhatt, Nikolaos Pappas, Maryam Habibi and Andrei Popescu-Belis, "Idiap at MediaEval 2013: Search and Hyperlinking Task", In *Proceedings of MediaEval 2013 Workshop*, Barcelona (MediaEval), Spain, 2013. URL http://ceur-ws.org/Vol-1043/mediaeval2013\_submission\_47.pdf.

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<sup>\*:</sup> equal contribution.