

WMT 2017

**Second Conference on  
Machine Translation**

**Proceedings**

September 7-8, 2017  
Copenhagen, Denmark

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## Introduction

The Second Conference on Machine Translation (WMT 2017) took place on Thursday and Friday, September 7–8, 2017 in Copenhagen, Denmark, immediately preceding the Conference on Empirical Methods in Natural Language Processing (EMNLP 2017).

This is the second time WMT has been held as a conference. The first time WMT was held as a conference was at ACL 2016 in Berlin, Germany. Prior to being a conference, WMT was held 10 times as a workshop. WMT was held for the first time at HLT-NAACL 2006 in New York City, USA. In the following years the Workshop on Statistical Machine Translation was held at ACL 2007 in Prague, Czech Republic, ACL 2008, Columbus, Ohio, USA, EACL 2009 in Athens, Greece, ACL 2010 in Uppsala, Sweden, EMNLP 2011 in Edinburgh, Scotland, NAACL 2012 in Montreal, Canada, ACL 2013 in Sofia, Bulgaria, ACL 2014 in Baltimore, USA, and EMNLP 2015 in Lisbon, Portugal.

The focus of our conference was to use parallel corpora for machine translation. Recent experimentation has shown that the performance of MT systems varies greatly with the source language. In this conference we encouraged researchers to investigate ways to improve the performance of MT systems for diverse languages, including morphologically more complex languages, languages with partial free word order, and low-resource languages.

Prior to the conference, in addition to soliciting relevant papers for review and possible presentation, we conducted 8 shared tasks. This consisted of three translation tasks: Machine Translation of News, Biomedical Translation, and Multimodal Machine Translation, two evaluation tasks: Metrics and Quality Estimation, as well as the Automatic Post-Editing, Neural MT Training, and the Bandit Learning tasks. Two of these tasks were run at WMT for the first time. The Neural MT Training task provide comparable conditions and encouraging researchers to explore training methods that lead to improved and more robust translation quality and help speed up the training. The Bandit Learning Task encourages participants to train and improve MT systems by learning from weak or partial feedback instead of the commonly used gold-standard human-generated translations.

The results of all shared tasks were announced at the conference, and these proceedings also include overview papers for the shared tasks, summarizing the results, as well as providing information about the data used and any procedures that were followed in conducting or scoring the tasks. In addition, there are short papers from each participating team that describe their underlying system in greater detail.

Like in previous years, we have received a far larger number of submissions than we could accept for presentation. This year we have received 40 full research paper submissions. In total, WMT 2017 featured 16 full paper oral presentations and 59 shared task poster presentations.

Holger Schwenk gave the invited on “Multilingual Representations and Applications in NLP”.

We would like to thank the members of the Program Committee for their timely reviews. We also would like to thank the participants of the shared task and all volunteers who helped with the evaluations.

Ondřej Bojar, Christian Buck, Rajen Chatterjee, Christian Federmann, Yvette Graham Barry Haddow, Matthias Huck, Antonio Jimeno Yepes, Philipp Koehn, Julia Kreutzer, Varvara Logacheva Christof Monz, Matteo Negri, Aurélie Névéol, Mariana Neves, Matt Post, Stefan Riezler, Raphael Rubino, Artem Sokolov, Lucia Specia, Marco Turchi, and Karin Verspoor

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# Conference Program

Thursday, September 7, 2016

**8:45–9:00**     *Opening Remarks*

**9:00–10:30**    **Session 1: Shared Tasks Overview Presentations I**

9:00–9:40     *Shared Task: News Translation*

*Findings of the 2017 Conference on Machine Translation (WMT17)*

Ondřej Bojar, Rajen Chatterjee, Christian Federmann, Yvette Graham, Barry Haddow, Shujian Huang, Matthias Huck, Philipp Koehn, Qun Liu, Varvara Logacheva, Christof Monz, Matteo Negri, Matt Post, Raphael Rubino, Lucia Specia and Marco Turchi

9:40–10:10    *Shared Task: Multimodal Translation*

*Findings of the Second Shared Task on Multimodal Machine Translation and Multilingual Image Description*

Desmond Elliott, Stella Frank, Loïc Barrault, Fethi Bougares and Lucia Specia

10:10–10:30   *Shared Task: Biomedical Translation*

*Findings of the WMT 2017 Biomedical Translation Shared Task*

Antonio Jimeno Yepes, Aurelie Neveol, Mariana Neves, Karin Verspoor, Ondrej Bojar, Arthur Boyer, Cristian Grozea, Barry Haddow, Madeleine Kittner, Yvonne Lichtblau, Pavel Pecina, Roland Roller, Rudolf Rosa, Amy Siu, Philippe Thomas and Saskia Trescher

**10:30-11:00**   *Coffee Break*

**Thursday, September 7, 2016 (continued)**

**11:00–12:30 Session 2: Shared Tasks Poster Session I**

11:00–12:30 *Shared Task: News Translation*

*CUNI submission in WMT17: Chimera goes neural*

Roman Sudarikov, David Mareček, Tom Kocmi, Dusan Varis and Ondřej Bojar

*LIMSI@WMT'17*

Franck Burlot, Pooyan Safari, Matthieu Labeau, Alexandre Allauzen and François Yvon

*SYSTRAN Purely Neural MT Engines for WMT2017*

Yongchao Deng, Jungi Kim, Guillaume Klein, Catherine KOBUS, Natalia Segal, Christophe Servan, Bo Wang, Dakun Zhang, Josep Crego and Jean Senellart

*FBK's Participation to the English-to-German News Translation Task of WMT 2017*

Mattia Antonino Di Gangi, Nicola Bertoldi and Marcello Federico

*The JHU Machine Translation Systems for WMT 2017*

Shuoyang Ding, Huda Khayrallah, Philipp Koehn, Matt Post, Gaurav Kumar and Kevin Duh

*The TALP-UPC Neural Machine Translation System for German/Finnish-English Using the Inverse Direction Model in Rescoring*

Carlos Escolano, Marta R. Costa-jussà and José A. R. Fonollosa

*LIUM Machine Translation Systems for WMT17 News Translation Task*

Mercedes García-Martínez, Ozan Caglayan, Walid Aransa, Adrien Bardet, Fethi Bougares and Loïc Barrault

*Extending hybrid word-character neural machine translation with multi-task learning of morphological analysis*

Stig-Arne Grönroos, Sami Virpioja and Mikko Kurimo

*The AFRL-MITLL WMT17 Systems: Old, New, Borrowed, BLEU*

Jeremy Gwinnup, Timothy Anderson, Grant Erdmann, Katherine Young, Michael Kazi, Elizabeth Salesky, Brian Thompson and Jonathan Taylor

*University of Rochester WMT 2017 NMT System Submission*

Chester Holtz, Chuyang Ke and Daniel Gildea



Thursday, September 7, 2016 (continued)

*LMU Munich's Neural Machine Translation Systems for News Articles and Health Information Texts*

Matthias Huck, Fabienne Braune and Alexander Fraser

*Rule-based Machine translation from English to Finnish*

Arvi Hurskainen and Jörg Tiedemann

*NRC Machine Translation System for WMT 2017*

Chi-kiu Lo, Boxing Chen, Colin Cherry, George Foster, Samuel Larkin, Darlene Stewart and Roland Kuhn

*The Helsinki Neural Machine Translation System*

Robert Östling, Yves Scherrer, Jörg Tiedemann, Gongbo Tang and Tommi Niemi-

*The QT21 Combined Machine Translation System for English to Latvian*

Jan-Thorsten Peter, Hermann Ney, Ondřej Bojar, Ngoc-Quan Pham, Jan Niehues, Alex Waibel, Franck Burlot, François Yvon, Mārcis Pinnis, Valters Sics, Joost Bastings, Miguel Rios, Wilker Aziz, Philip Williams, Frédéric Blain and Lucia Specia

*The RWTH Aachen University English-German and German-English Machine Translation System for WMT 2017*

Jan-Thorsten Peter, Andreas Guta, Tamer Alkhouli, Parnia Bahar, Jan Rosendahl, Nick Rossenbach, Miguel Graça and Hermann Ney

*The Karlsruhe Institute of Technology Systems for the News Translation Task in WMT 2017*

Ngoc-Quan Pham, Jan Niehues, Thanh-Le Ha, Eunah Cho, Matthias Sperber and Alexander Waibel

*Tilde's Machine Translation Systems for WMT 2017*

Mārcis Pinnis, Rihards Krišlauks, Toms Miks, Daiga Deksnē and Valters Šics

*C-3MA: Tartu-Riga-Zurich Translation Systems for WMT17*

Matīss Rīkters, Chantal Amrhein, Maksym Del and Mark Fishel

*The University of Edinburgh's Neural MT Systems for WMT17*

Rico Sennrich, Alexandra Birch, Anna Currey, Ulrich Germann, Barry Haddow, Kenneth Heafield, Antonio Valerio Miceli Barone and Philip Williams

*XMU Neural Machine Translation Systems for WMT 17*

Zhixing Tan, Boli Wang, Jinming Hu, Yidong Chen and xiaodong shi

*The JAIST Machine Translation Systems for WMT 17*

Long Trieu, Trung-Tin Pham and Le-Minh Nguyen

**Thursday, September 7, 2016 (continued)**

*Sogou Neural Machine Translation Systems for WMT17*

Yuguang Wang, Shanbo Cheng, Liyang Jiang, Jiajun Yang, Wei Chen, Muze Li, Lin Shi, Yanfeng Wang and Hongtao Yang

*PJIT's systems for WMT 2017 Conference*

Krzysztof Wolk and Krzysztof Marasek

*Hunter MT: A Course for Young Researchers in WMT17*

Jia Xu, Yi Zong Kuang, Shondell Baijoo, Jacob Hyun Lee, Uman Shahzad, Mir Ahmed, Meredith Lancaster and Chris Carlan

*CASICT-DCU Neural Machine Translation Systems for WMT17*

Jinchao Zhang, Peerachet Porkaew, Jiawei Hu, Qiuye Zhao and Qun Liu

11:00–12:30 *Shared Task: Multi-Modal Translation*

*LIUM-CVC Submissions for WMT17 Multimodal Translation Task*

Ozan Caglayan, Walid Aransa, Adrien Bardet, Mercedes García-Martínez, Fethi Bougares, Loïc Barrault, Marc Masana, Luis Herranz and Joost van de Weijer

*DCU System Report on the WMT 2017 Multi-modal Machine Translation Task*

Iacer Calixto, Koel Dutta Chowdhury and Qun Liu

*The AFRL-OSU WMT17 Multimodal Translation System: An Image Processing Approach*

John Duseelis, Michael Hutt, Jeremy Gwinnup, James Davis and Joshua Sandvick

*CUNI System for the WMT17 Multimodal Translation Task*

Jindřich Helcl and Jindřich Libovický

*Generating Image Descriptions using Multilingual Data*

Alan Jaffe

*OSU Multimodal Machine Translation System Report*

Mingbo Ma, Dapeng Li, Kai Zhao and Liang Huang

*Sheffield MultiMT: Using Object Posterior Predictions for Multimodal Machine Translation*

Pranava Swaroop Madhyastha, Josiah Wang and Lucia Specia

**Thursday, September 7, 2016 (continued)**

*NICT-NAIST System for WMT17 Multimodal Translation Task*

Jingyi Zhang, Masao Utiyama, Eiichiro Sumita, Graham Neubig and Satoshi Nakamura

11:00–12:30 *Shared Task: Biomedical Translation*

*Automatic Threshold Detection for Data Selection in Machine Translation*

Mirela-Stefania Duma and Wolfgang Menzel

**12:30–14:00** *Lunch*

**14:00–15:30** **Session 3: Invited Talk**

14:00–15:30 *Holger Schwenk (Facebook): Multilingual Representions and Applications in NLP*

**15:30–16:00** *Coffee Break*

**16:00–17:30** **Session 4: Research Papers on Lexicon and Morphology**

16:00–16:15 *Sense-Aware Statistical Machine Translation using Adaptive Context-Dependent Clustering*

Xiao Pu, Nikolaos Pappas and Andrei Popescu-Belis

16:15–16:30 *Improving Word Sense Disambiguation in Neural Machine Translation with Sense Embeddings*

Annette Rios Gonzales, Laura Mascarell and Rico Sennrich

16:30–16:45 *Word Representations in Factored Neural Machine Translation*

Franck Burlot, Mercedes García-Martínez, Loïc Barrault, Fethi Bougares and François Yvon

16:45–17:00 *Modeling Target-Side Inflection in Neural Machine Translation*

Aleš Tamchyna, Marion Weller-Di Marco and Alexander Fraser

17:00–17:15 *Evaluating the morphological competence of Machine Translation Systems*

Franck Burlot and François Yvon

**Thursday, September 7, 2016 (continued)**

17:15–17:30 *Target-side Word Segmentation Strategies for Neural Machine Translation*  
Matthias Huck, Simon Riess and Alexander Fraser

**Friday, September 8, 2017**

**9:00–10:30 Session 5: Shared Tasks Overview Presentations II**

9:00–9:20 *Shared Task: Quality Estimation*

9:20–9:40 *Shared Task: Metrics*

*Results of the WMT17 Metrics Shared Task*

Ondřej Bojar, Yvette Graham and Amir Kamran

9:40–10:00 *Shared Task: Automatic Post-Editing*

10:00–10:15 *Shared Task: Bandit Learning*

*A Shared Task on Bandit Learning for Machine Translation*

Artem Sokolov, Julia Kreutzer, Kellen Sunderland, Pavel Danchenko, Witold Szymaniak, Hagen Fürstenu and Stefan Riezler

10:15–10:30 *Shared Task: Neural Training*

*Results of the WMT17 Neural MT Training Task*

Ondřej Bojar, Jindřich Helcl, Tom Kocmi, Jindřich Libovický and Tomáš Musil

**10:30-11:00 Coffee Break**

**Friday, September 8, 2017 (continued)**

**11:00–12:30 Session 6: Shared Tasks Poster Session II**

11:00–12:30 *Shared Task: Quality Estimation*

*Sentence-level quality estimation by predicting HTER as a multi-component metric*  
Eleftherios Avramidis

*Predicting Translation Performance with Referential Translation Machines*  
Ergun Biçici

*Bilexical Embeddings for Quality Estimation*  
Frédéric Blain, Carolina Scarton and Lucia Specia

*Improving Machine Translation Quality Estimation with Neural Network Features*  
Zhiming Chen, Yiming Tan, Chenlin Zhang, Qingyu Xiang, Lilin Zhang, Maoxi Li  
and Mingwen WANG

*UHH Submission to the WMT17 Quality Estimation Shared Task*  
Melania Duma and Wolfgang Menzel

*Predictor-Estimator using Multilevel Task Learning with Stack Propagation for  
Neural Quality Estimation*  
Hyun Kim, Jong-Hyeok Lee and Seung-Hoon Na

*Unbabel's Participation in the WMT17 Translation Quality Estimation Shared Task*  
André F. T. Martins, Fabio Kepler and Jose Monteiro

*Feature-Enriched Character-Level Convolutions for Text Regression*  
Gustavo Paetzold and Lucia Specia

11:00–12:30 *Shared Task: Metrics*

*UHH Submission to the WMT17 Metrics Shared Task*  
Melania Duma and Wolfgang Menzel

**Friday, September 8, 2017 (continued)**

*MEANT 2.0: Accurate semantic MT evaluation for any output language*

Chi-kiu Lo

*Blend: a Novel Combined MT Metric Based on Direct Assessment — CASICT-DCU submission to WMT17 Metrics Task*

Qingsong Ma, Yvette Graham, Shugen Wang and Qun Liu

*CUNI Experiments for WMT17 Metrics Task*

David Mareček, Ondřej Bojar, Ondřej Hübsch, Rudolf Rosa and Dusan Varis

*chrF++: words helping character n-grams*

Maja Popović

*bleu2vec: the Painfully Familiar Metric on Continuous Vector Space Steroids*

Andre Tättar and Mark Fishel

11:00–12:30 *Shared Task: Automatic Post-Editing*

*LIG-CRISAL Submission for the WMT 2017 Automatic Post-Editing Task*

Alexandre Berard, Laurent Besacier and Olivier Pietquin

*Multi-source Neural Automatic Post-Editing: FBK's participation in the WMT 2017 APE shared task*

Rajen Chatterjee, M. Amin Farajian, Matteo Negri, Marco Turchi, Ankit Srivastava and Santanu Pal

*The AMU-UEdin Submission to the WMT 2017 Shared Task on Automatic Post-Editing*

Marcin Junczys-Dowmunt and Marcin Junczys-Dowmunt

*Ensembling Factored Neural Machine Translation Models for Automatic Post-Editing and Quality Estimation*

Chris Hokamp

*Neural Post-Editing Based on Quality Estimation*

Yiming Tan, Zhiming Chen, Liu Huang, Lilin Zhang, Maoxi Li and Mingwen Wang

*CUNI System for WMT17 Automatic Post-Editing Task*

Dusan Varis and Ondřej Bojar

**Friday, September 8, 2017 (continued)**

11:00–12:30 *Shared Task: Bandit Learning*

*The UMD Neural Machine Translation Systems at WMT17 Bandit Learning Task*  
Amr Sharaf, Shi Feng, Khanh Nguyen, Kianté Brantley and Hal Daumé III

*LIMSIS Submission for WMT'17 Shared Task on Bandit Learning*  
Guillaume Wisniewski

11:00–12:30 *Shared Task: Neural Training*

*Variable Mini-Batch Sizing and Pre-Trained Embeddings*  
Mostafa Abdou, Vladan Glončak and Ondřej Bojar

*The AFRL WMT17 Neural Machine Translation Training Task Submission*  
Jeremy Gwinnup, Grant Erdmann and Katherine Young

**12:30–14:00** *Lunch*

**14:00–15:15** **Session 7: Research Papers on Syntax and Deep Models**

14:00–14:15 *Predicting Target Language CCG Supertags Improves Neural Machine Translation*  
Maria Nadejde, Siva Reddy, Rico Sennrich, Tomasz Dwojak, Marcin Junczys-Dowmunt, Philipp Koehn and Alexandra Birch

14:15–14:30 *Exploiting Linguistic Resources for Neural Machine Translation Using Multi-task Learning*  
Jan Niehues and Eunah Cho

14:30–14:45 *Tree as a Pivot: Syntactic Matching Methods in Pivot Translation*  
Akiva Miura, Graham Neubig, Katsuhito Sudoh and Satoshi Nakamura

14:45–15:00 *Deep architectures for Neural Machine Translation*  
Antonio Valerio Miceli Barone, Jindřich Helcl, Rico Sennrich, Barry Haddow and Alexandra Birch

15:00–15:15 *Biasing Attention-Based Recurrent Neural Networks Using External Alignment Information*  
Tamer Alkhouli and Hermann Ney

**Friday, September 8, 2017 (continued)**

**15:15–16:00** *Coffee Break*

**16:00–17:15** **Session 8: Research Papers on Domain Adaptation and External Data**

16:00–16:15 *Effective Domain Mixing for Neural Machine Translation*

Denny Britz, Quoc Le and Reid Pryzant

16:15–16:30 *Multi-Domain Neural Machine Translation through Unsupervised Adaptation*

M. Amin Farajian, Marco Turchi, Matteo Negri and Marcello Federico

16:30–16:45 *Adapting Neural Machine Translation with Parallel Synthetic Data*

Mara China-Rios, Álvaro Peris and Francisco Casacuberta

16:45–17:00 *Copied Monolingual Data Improves Low-Resource Neural Machine Translation*

Anna Currey, Antonio Valerio Miceli Barone and Kenneth Heafield

17:00–17:15 *Guiding Neural Machine Translation Decoding with External Knowledge*

Rajen Chatterjee, Matteo Negri, Marco Turchi, Marcello Federico, Lucia Specia and Frédéric Blain