

# Language Transfer for Early Warning of Epidemics from Social Media

**Mattias Appelgren<sup>1</sup>, Patrick Schrempf<sup>1,2</sup>, Matúš Falis<sup>1</sup>, Satoshi Ikeda<sup>1</sup>, Alison Q O'Neil<sup>1,3</sup>**

<sup>1</sup>Canon Medical Research Europe Ltd. <sup>2</sup>University of St Andrews <sup>3</sup>University of Edinburgh  
AI + HADR Workshop, NeurIPS 2019 (Vancouver, Canada)

13 December 2019

# Motivation

---

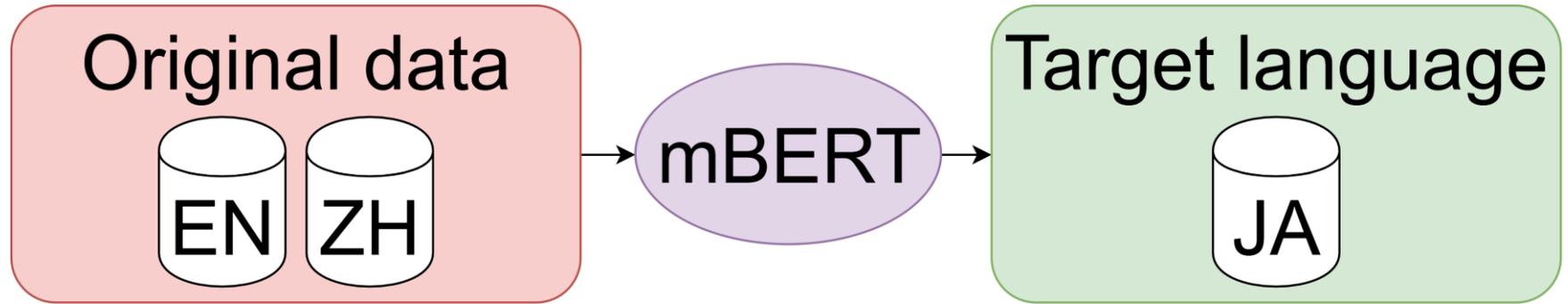
- Diseases spread across populations speaking different languages
- To track red flag medical symptoms in epidemics we need models that work across multiple languages
- It is difficult, time-consuming and expensive to construct training datasets in many languages

# Data (MedWeb NTCIR-13 challenge [1])

Dataset	#Pseudo-Tweets	Mean #labels per example	Influenza	Diarrhoea	Hayfever	Cough	Headache	Fever	Runny nose	Cold	#Examples with no labels
Training	1,920	0.997	106	182	163	227	251	345	375	265	530
Test	640	0.933	24	64	46	80	77	93	123	90	195

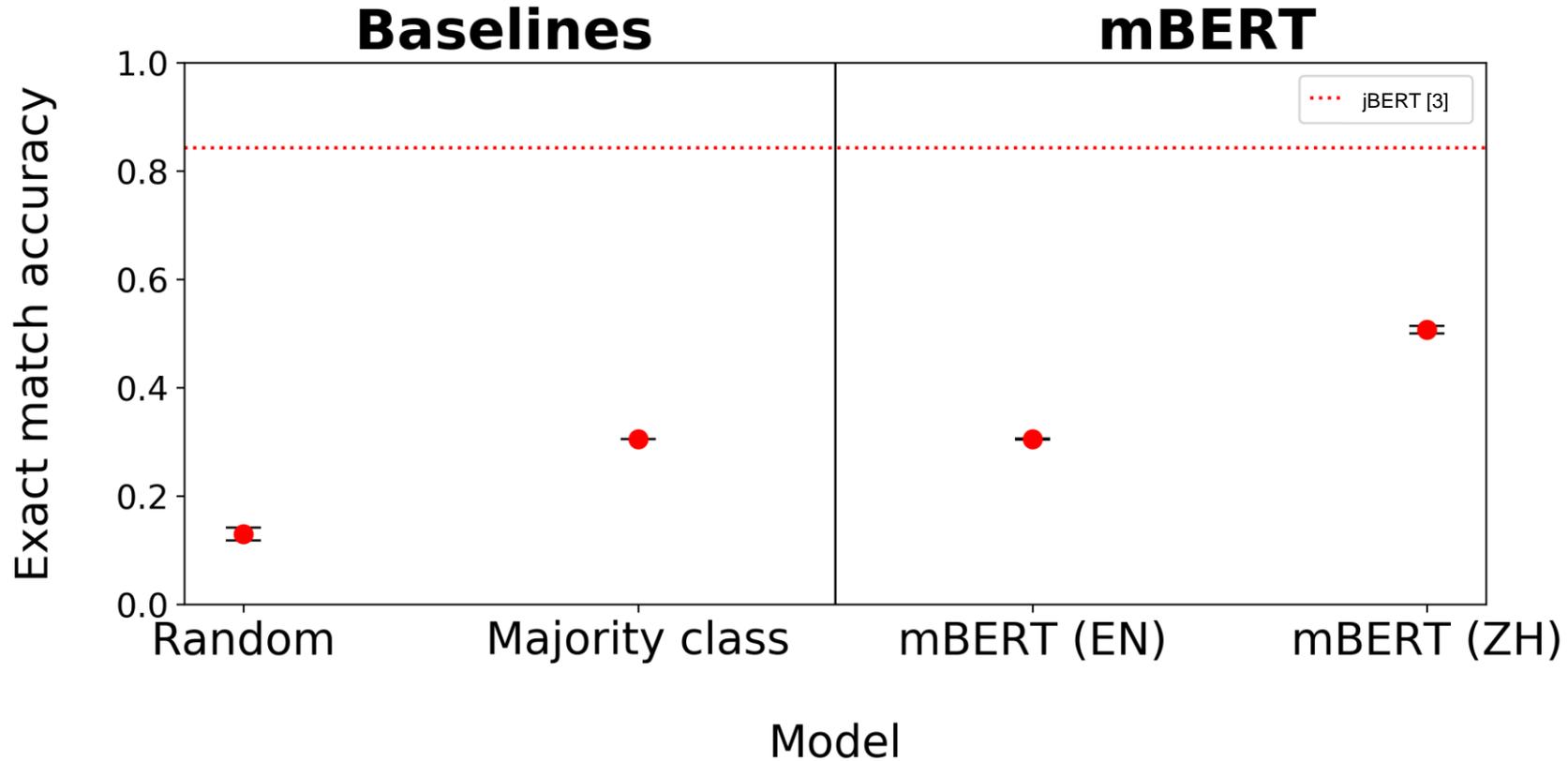
Pseudo-tweet		Labels
(ja)	風邪を引くと全身がだるくなる。	
(en)	The cold makes my whole body weak.	Cold
(zh)	一感冒就身酸无力。	

# Experiment – Zero-shot language transfer

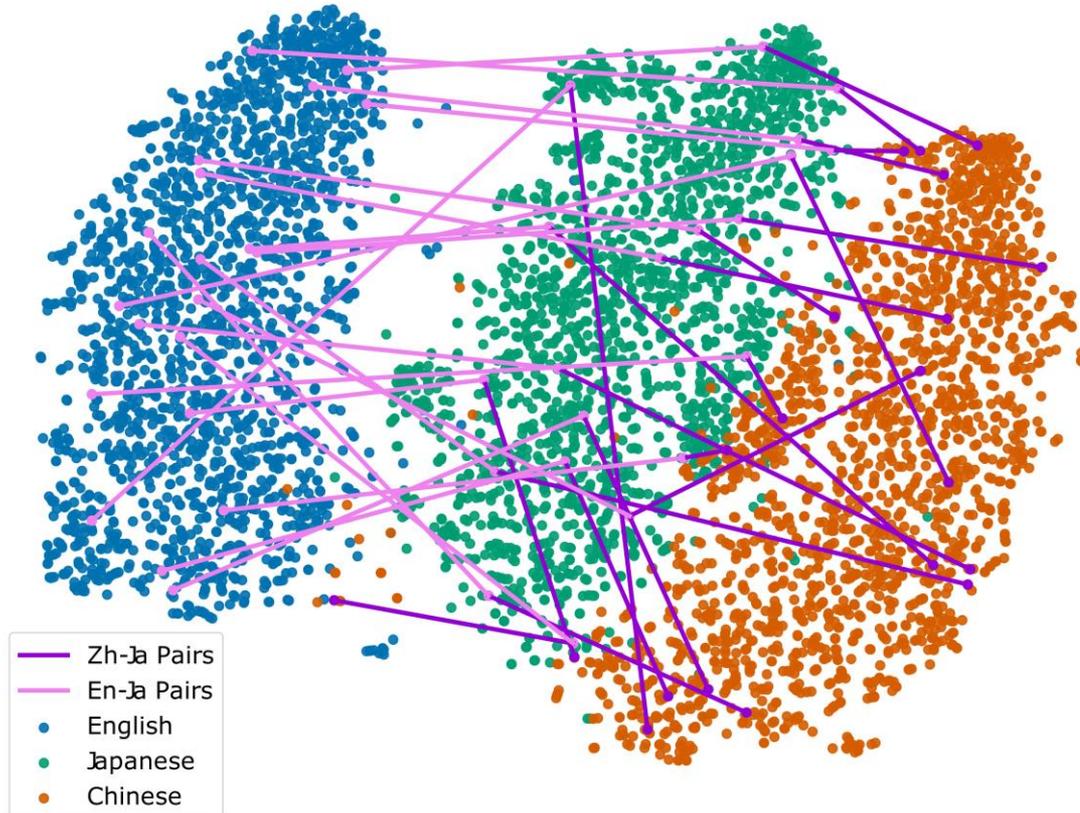


Multilingual BERT (mBERT) [2]

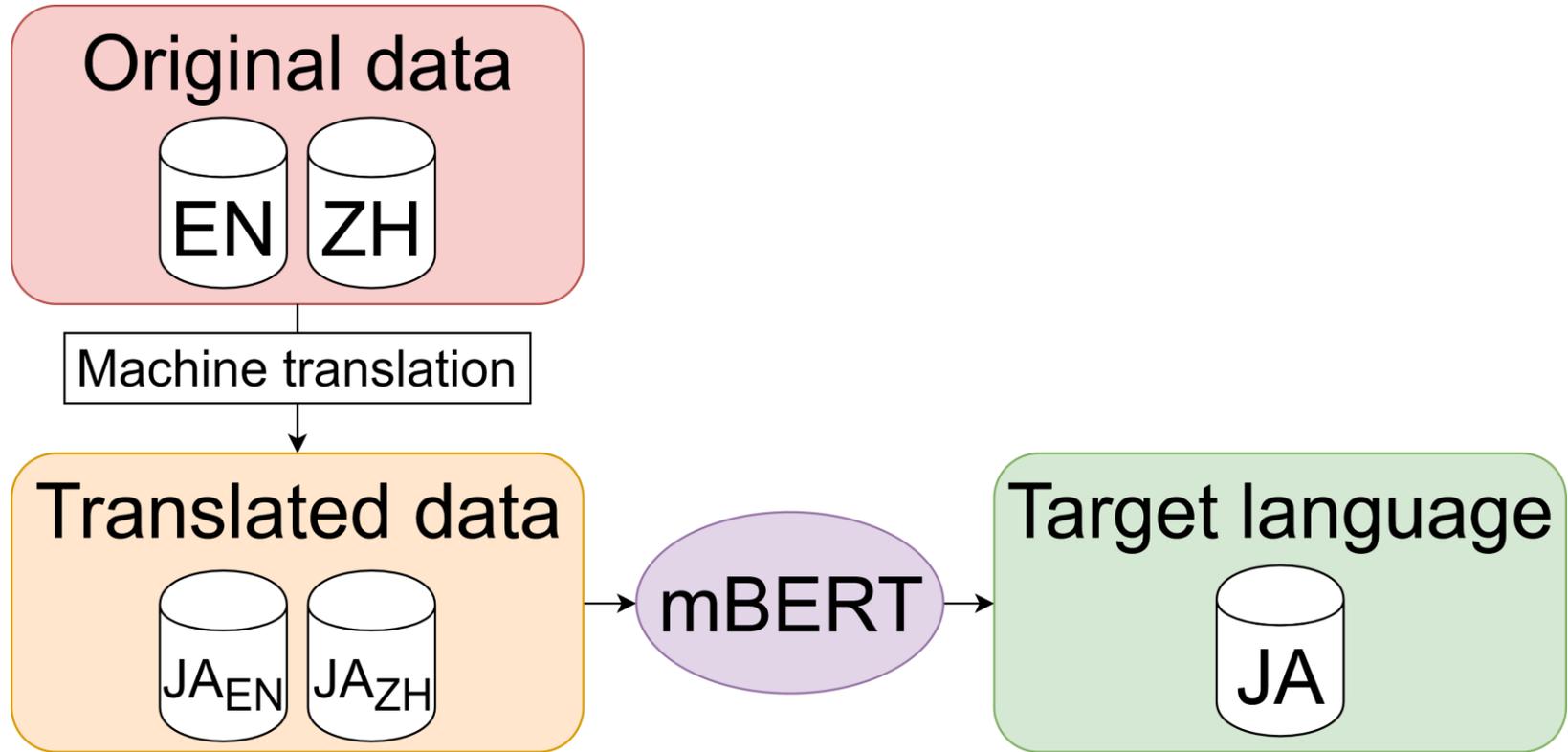
# Results – Zero-shot language transfer



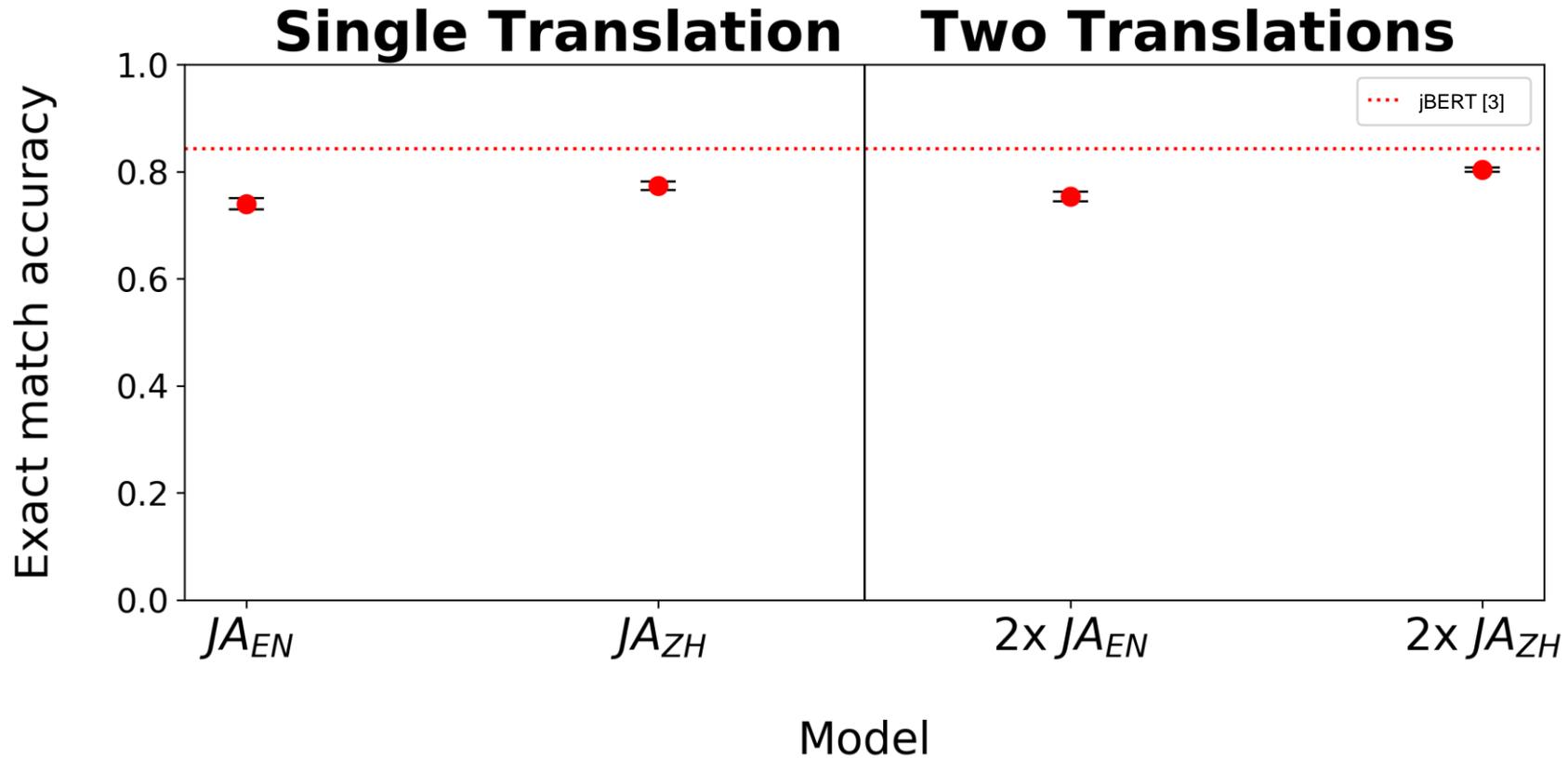
# Analysis – Zero-shot language transfer



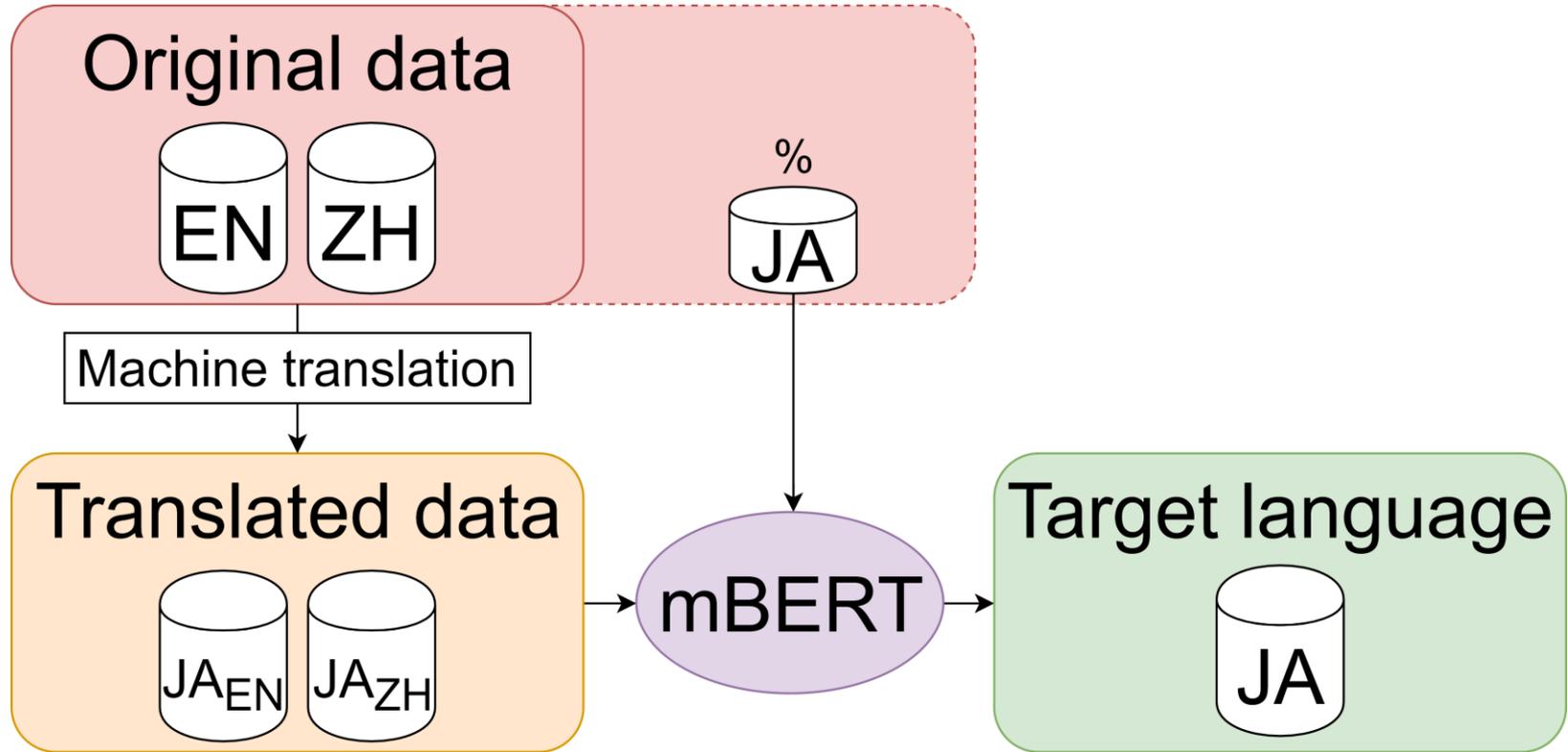
# Experiment – Machine translated data



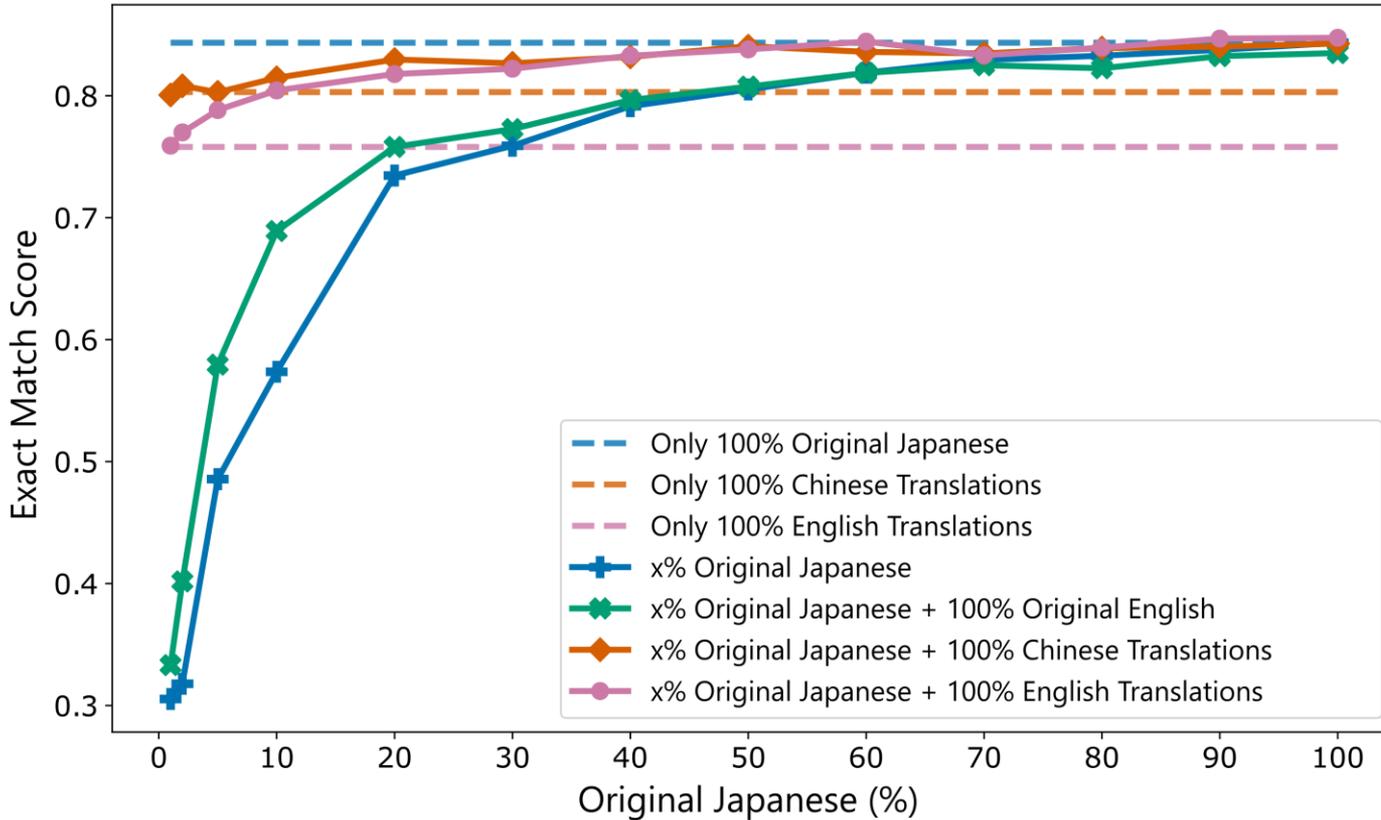
# Results – Machine translated data



# Experiment – Mixing translated data



# Results – Mixing translated data



# (Mis)translations

---

風邪を引くと全身がだるくなる。

The cold makes my whole body weak.

**“Cold” has 2 meanings: cold (temperature) and cold (illness).**  
Both make sense in this context – but one does not match the label!

# Conclusions

---

- Choice of source language impacts the performance, with Chinese-Japanese being a better language pair than English-Japanese
- Training on machine translated data shows promise, especially when used with small amounts of target language data



Mattias  
Appelgren



Patrick  
Schrempf



Matúš  
Falis



Satoshi  
Ikeda



Alison  
O'Neil



University of  
St Andrews

FOUNDED  
1413

**Canon**

CANON MEDICAL SYSTEMS



THE UNIVERSITY  
of EDINBURGH

**Canon**

<https://research.eu.medical.canon/>

# References

---

- [1] Aramaki et al., NTCIR-13 MedWeb (Medical Natural Language Processing for Web Document) Task, <http://mednlp.jp/medweb/NTCIR-13/>
- [2] Multilingual BERT (mBERT),  
<https://github.com/google-research/bert/blob/master/multilingual.md>
- [3] Kikuta et al., BERT pre-trained model trained on Japanese Wikipedia articles.

# *Made For life*

For over 100 years, the Canon Medical Systems 'Made for Life' philosophy prevails as our ongoing commitment to humanity - generations of inherited passion creates a legacy of medical innovation and service that continues to evolve as we do. By engaging the brilliant minds of many, we continue to set the benchmark, ~~because we believe quality of life should be a given, not the exception.~~



University of  
St Andrews | FOUNDED  
1413 |

**Canon**  
CANON MEDICAL SYSTEMS



THE UNIVERSITY  
of EDINBURGH