

# Language Transfer for Early Warning of Epidemics from Social Media

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# Motivation

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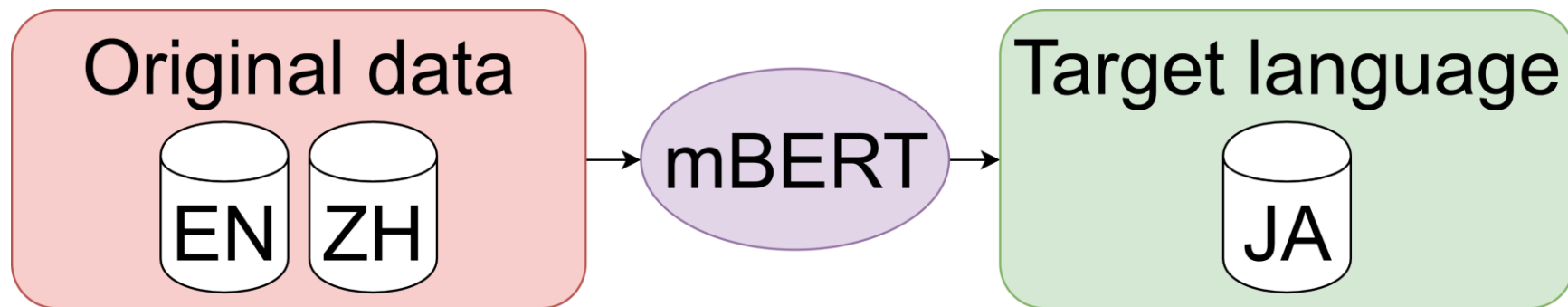
- Diseases spread across populations speaking different languages
- To track red flag medical symptoms in epidemics we need models that work across multiple languages
- It is difficult, time-consuming and expensive to construct training datasets in many languages

# 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

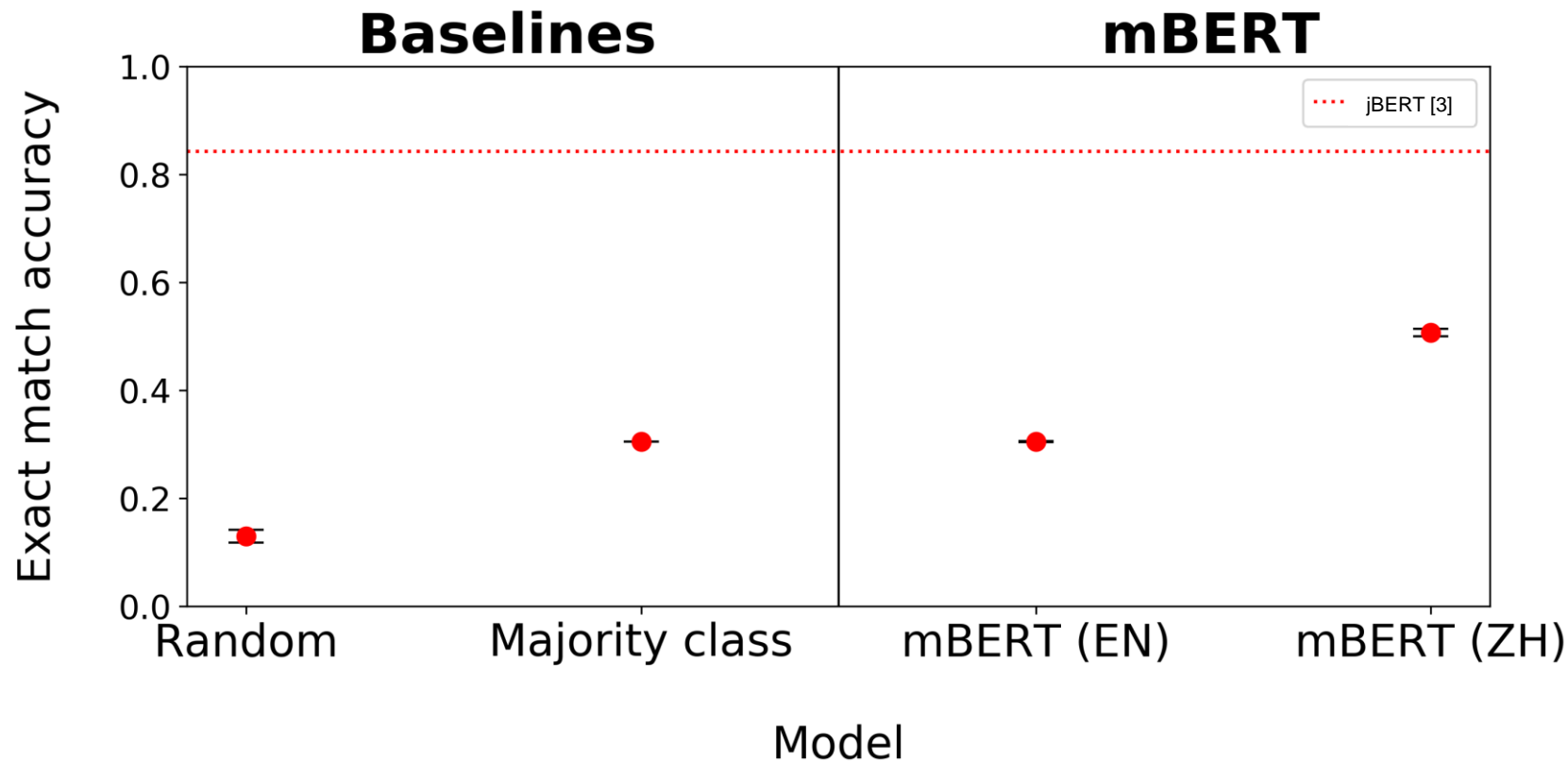
Pseudo-tweet		Labels
(ja)	風邪を引くと全身がだるくなる。	Cold
(en)	The cold makes my whole body weak.	
(zh)	一感冒就身酸无力。	

# Experiment – Zero-shot language transfer

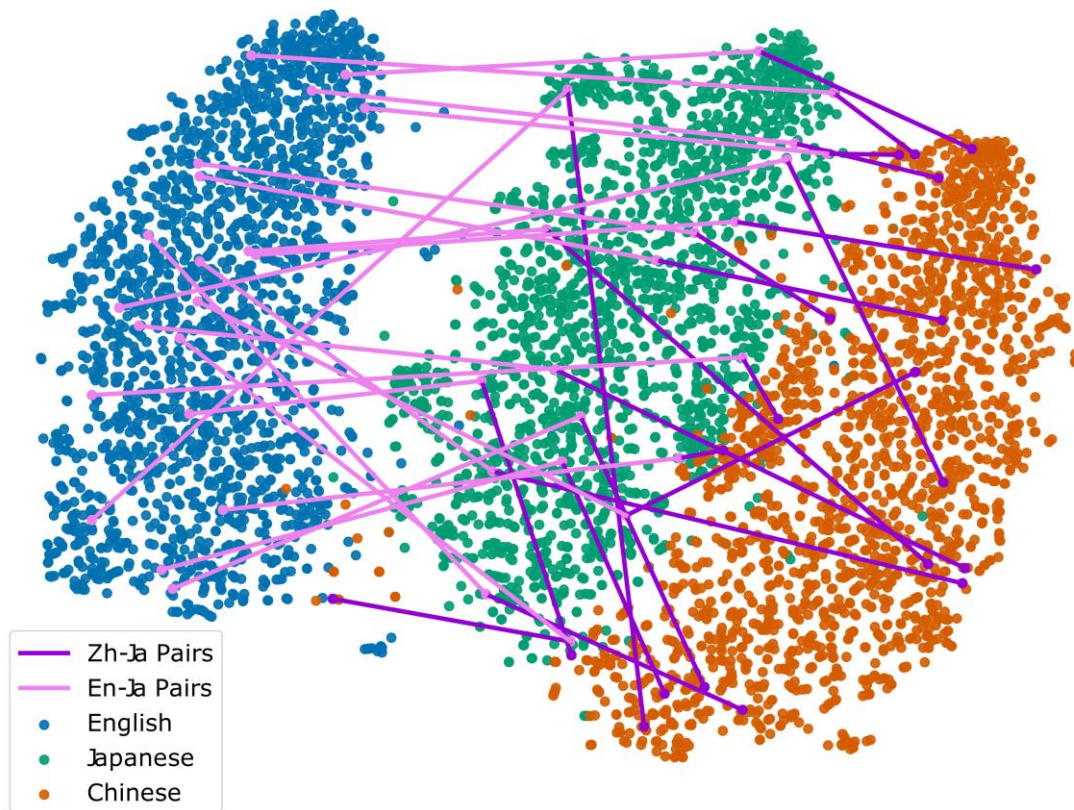


Multilingual BERT (mBERT) [2]

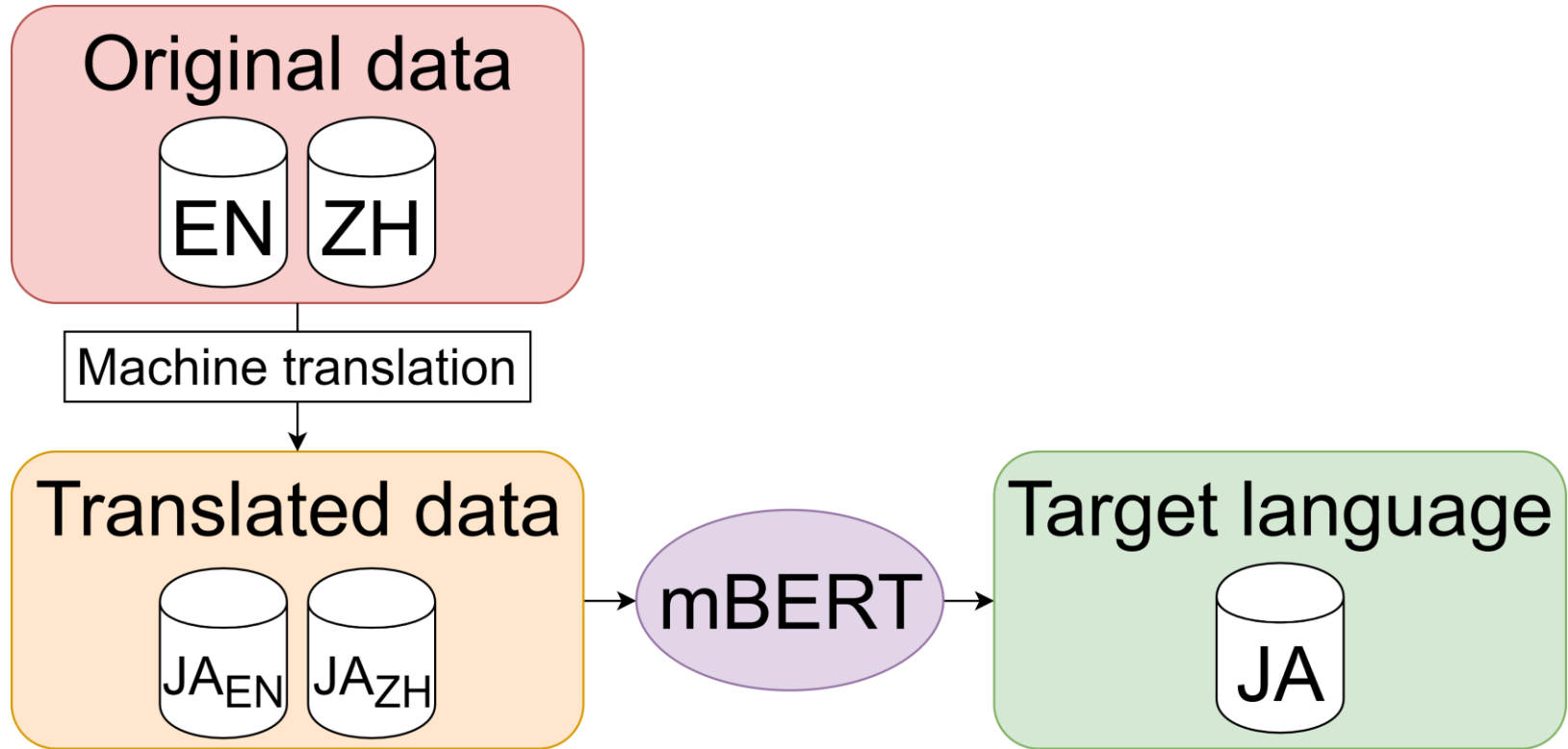
# Results – Zero-shot language transfer



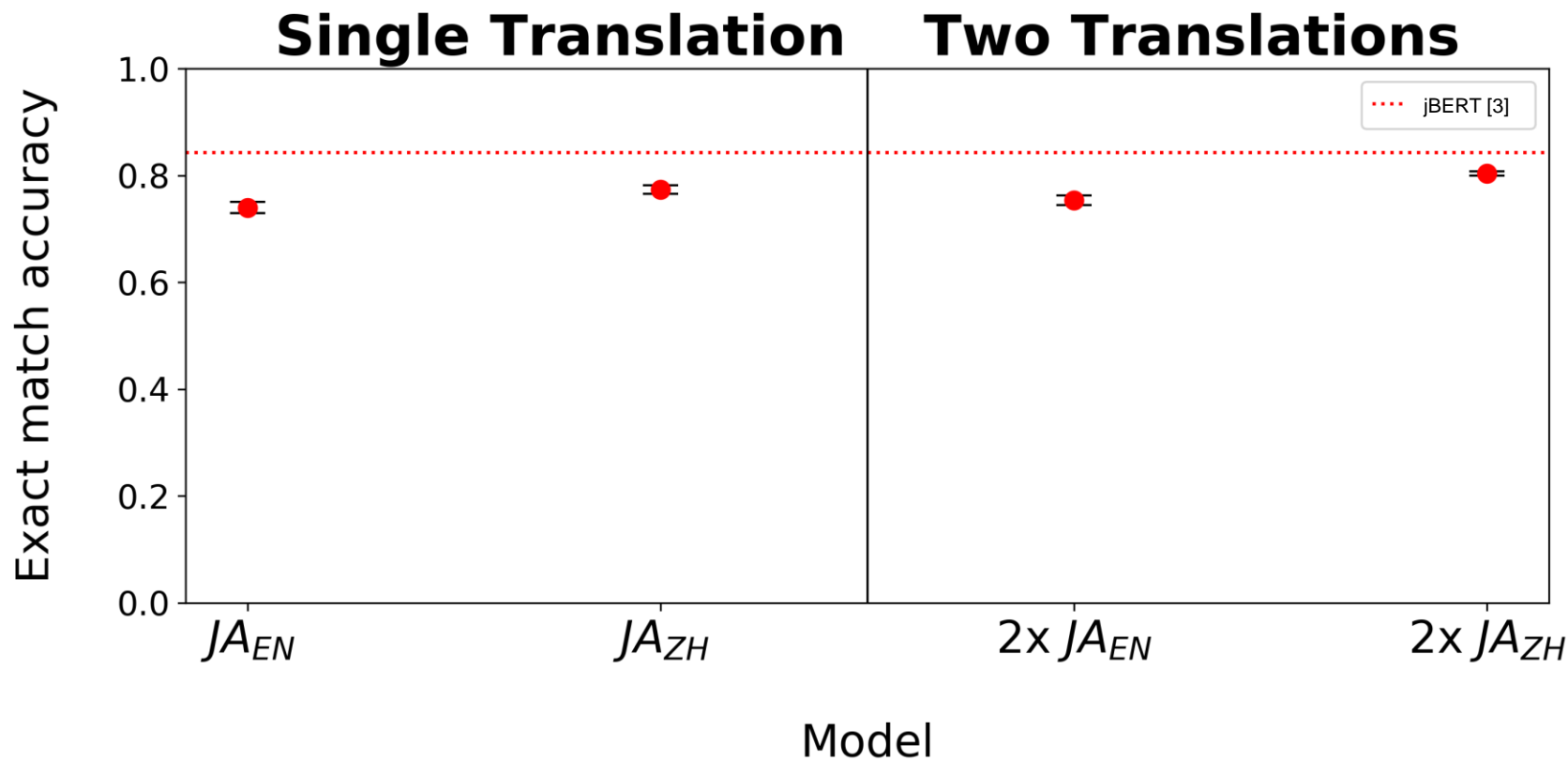
# Analysis – Zero-shot language transfer



# Experiment – Machine translated data

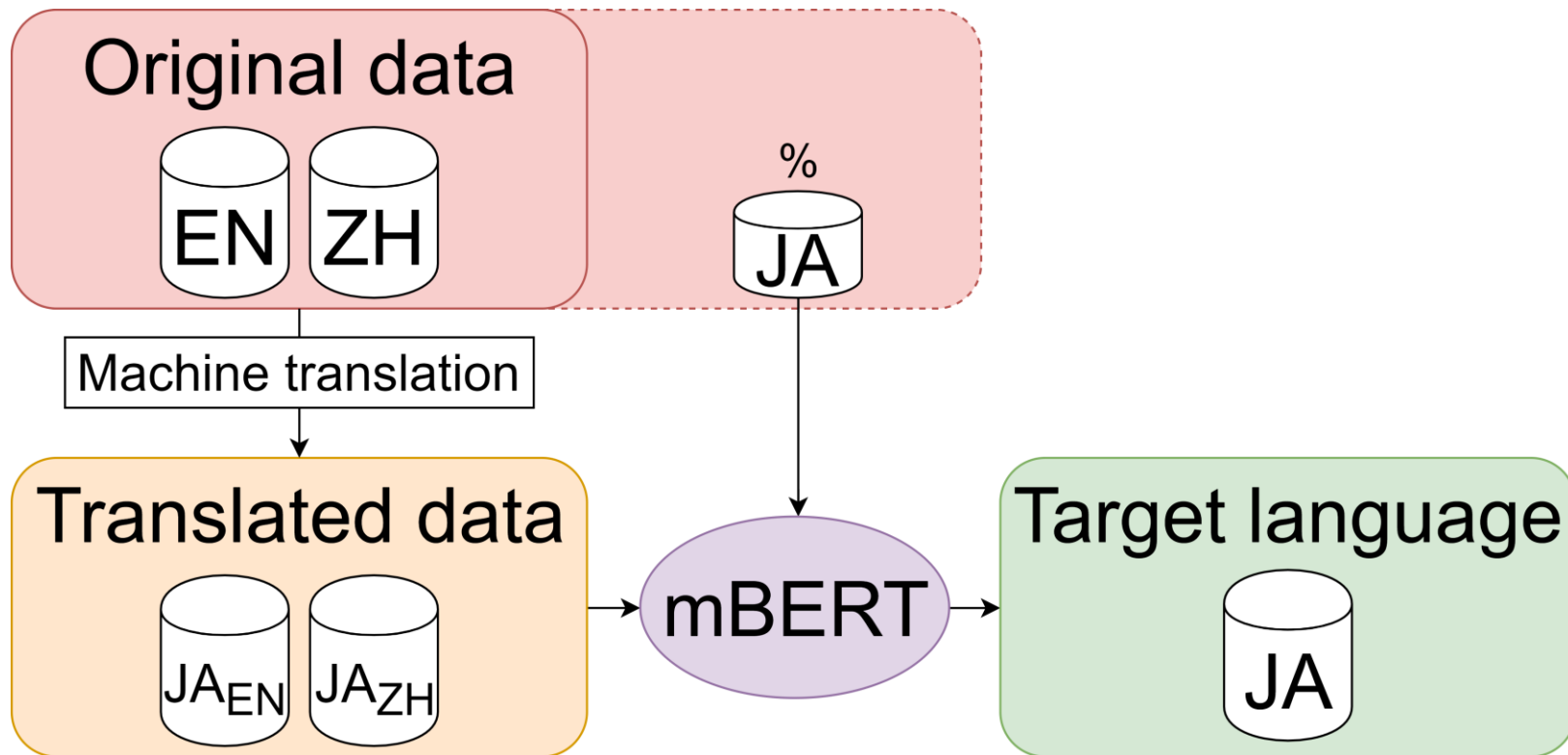


# Results – Machine translated data

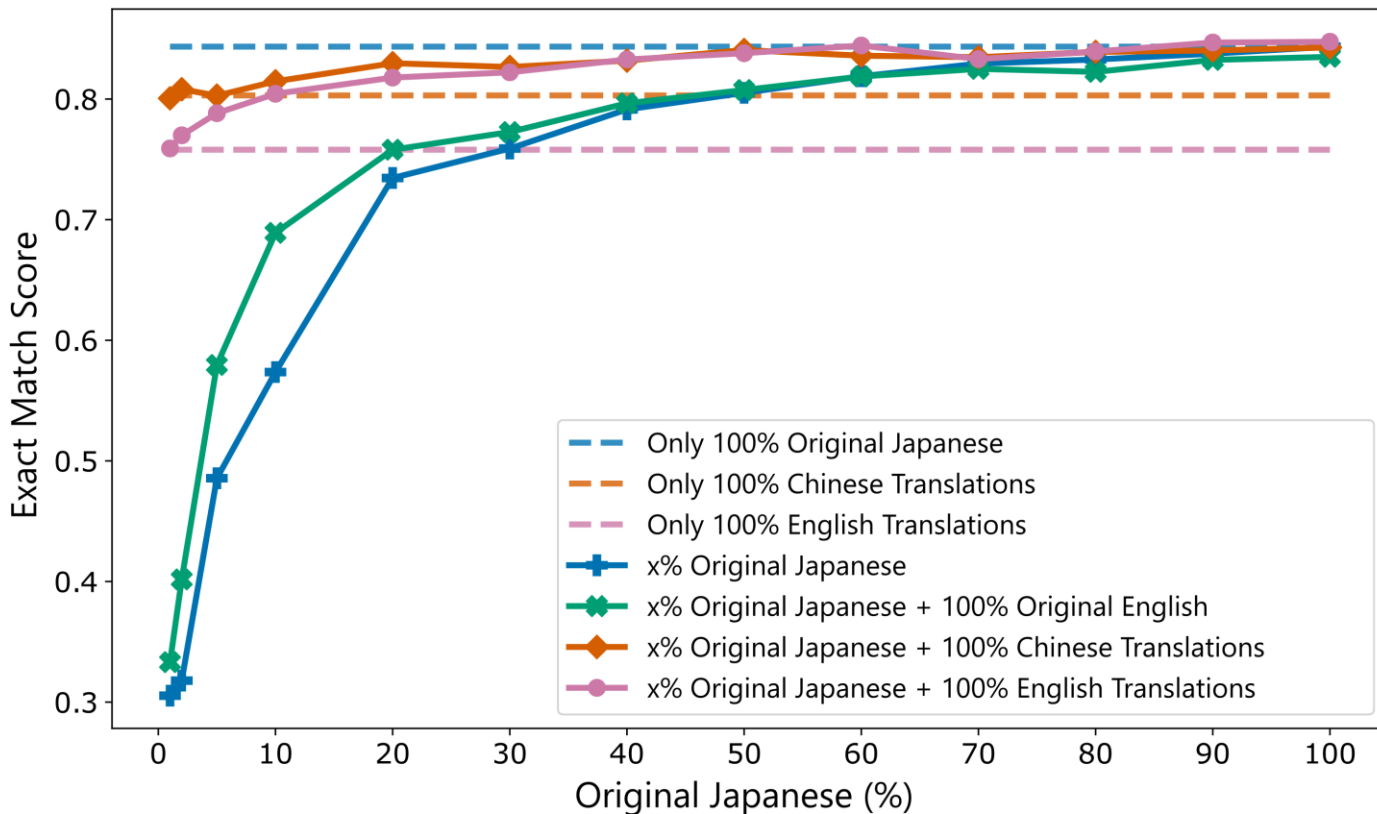




# Experiment – Mixing translated data



# Results – Mixing translated data



# (Mis)translations

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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

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- 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



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

# References

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- [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.

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