## **CLIP**

Image classification with Natural Language Supervision

#### Michał Gozdera



gozdera.michal@gmail.com



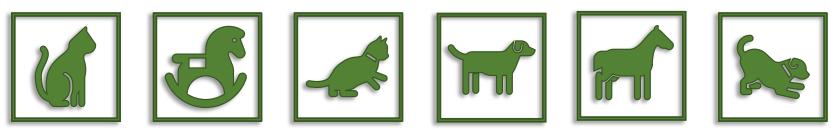
linkedin.com/in/gozderam



#### Our task











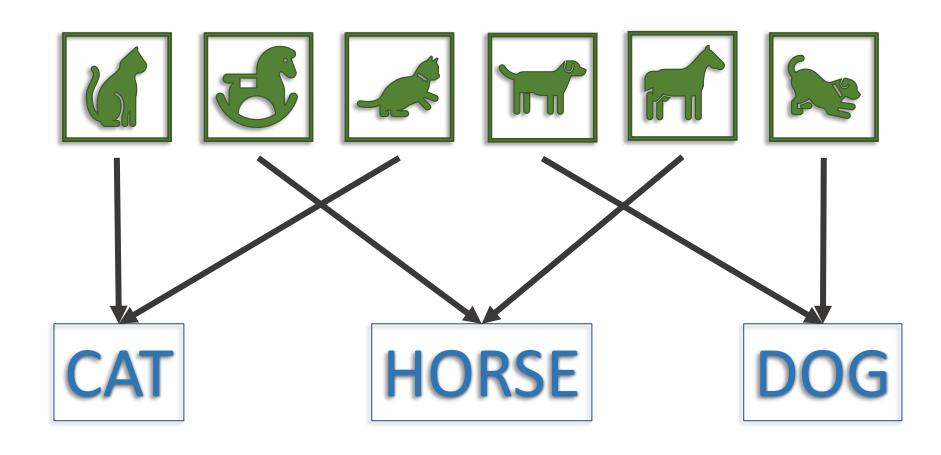








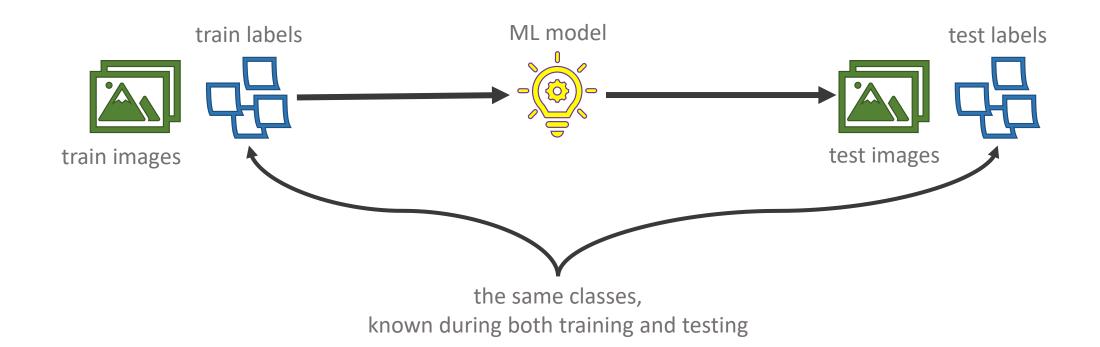
#### Our task



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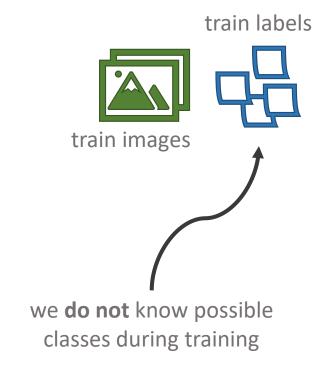


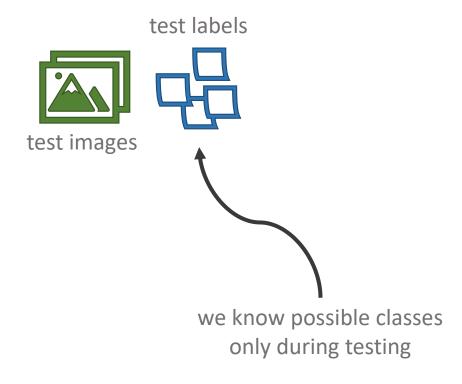
### Traditional approach



#### What if...

... we would like to build a model capable of classifying any class?





### Why such a model can be useful?

TRANSFER LEARNING

Train once and use for multiple tasks

Use the model without fine-tuning

ZERO-SHOT LEARNING

#### How to build such a model?

- Want to predict any class
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- Want to predict any class → need huge amount of data
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- IDEA? Gather data from Internet (Instagram etc.) in the form of (image, text description)











Liczba polubień: 924.789



fcbarcelona 🥯 👑 Happy birthday, Xavi Per molts anys, Míster Feliz cumpleaños, Xavi

Zobacz tłumaczenie

Zobacz wszystkie komentarze: 1748

Dodaj komentarz...

#### Natural Language supervision

NATURAL LANGUAGE SUPERVISION

Train data in traditional approach

Train data in NL supervision approach





images

labels



images



text descriptions

Option 1



Option 1



Too hard to train.

Option 1

Predict descriptions

Too hard to train.

Option 2

Predict bag-of-words

III

Option 1

predict descriptions

Too hard to train.

Option 2

predict bag-of-words

Too hard to train.

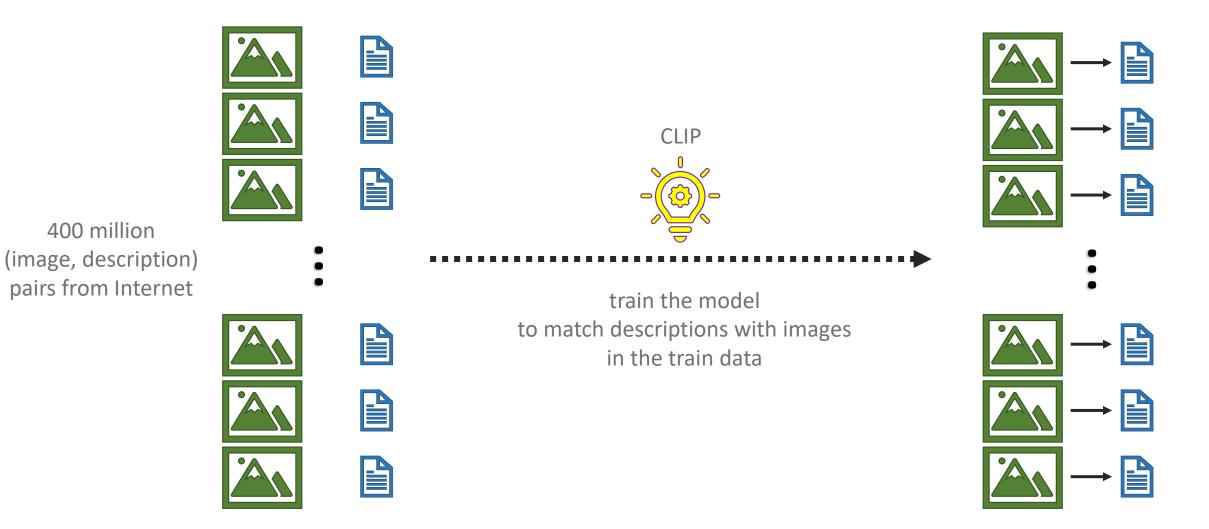
Option 3

predict descriptions Too hard to train. Option 1 predict bag-of-words Option 2 Too hard to train. match images and descriptions

predict descriptions Too hard to train. Option 1 predict bag-of-words Option 2 Too hard to train. match images and descriptions YES! Option 3

This is the CLIP model!

#### CLIP – training



#### CLIP – testing

How to predict a label for an image when model can only match images with their descriptions?

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How to predict a label for an image when model can only match images with their descriptions?

Treat labels as text descriptions, for example:

 $cat \rightarrow This picture shows a cat.$ 







transform labels to descriptions





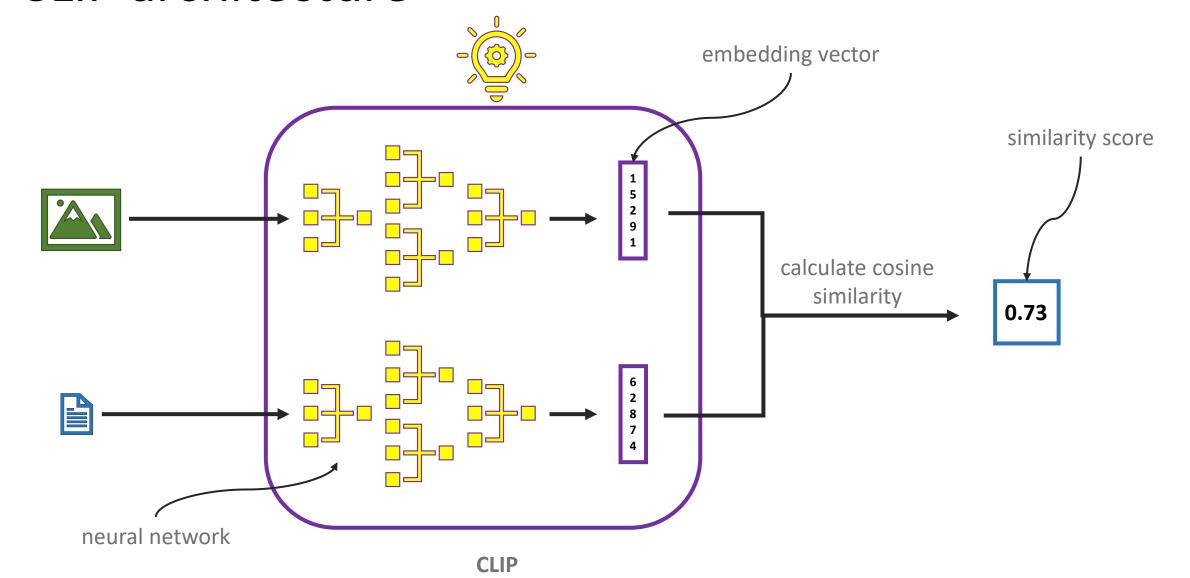
match images with descriptions using **CLIP** 



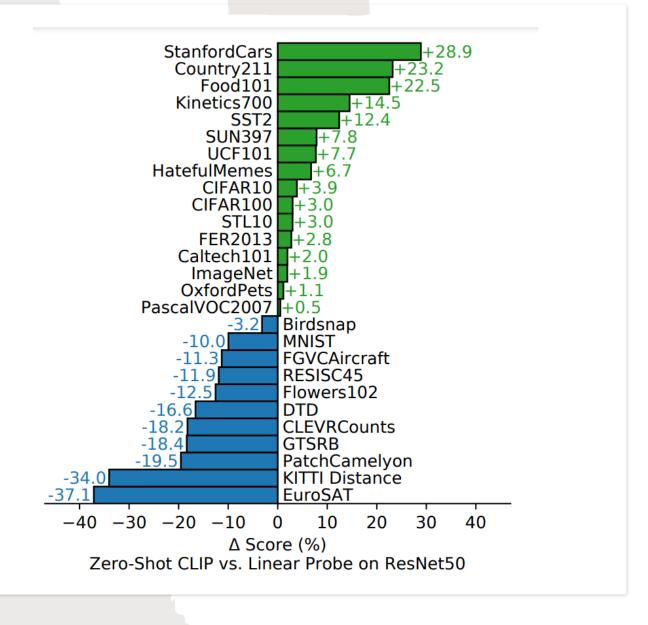




#### **CLIP** architecture



# CLIP classification results



## Thank you for your attention!

Let's move to the quiz now: kahoot.it

And then to the workshop: github.com/gozderamichal/data\_literacy

#### Based on:

Alec Radford, Jong Wook Kim, Chris Hallacy, Aditya Ramesh, Gabriel Goh, Sandhini Agarwal, Girish Sastry, Amanda Askell, Pamela Mishkin, Jack Clark, Gretchen Krueger, Ilya Sutskever Proceedings of the 38th International Conference on Machine Learning, PMLR 139:8748-8763, 2021