# Bert for Sentiment Analysis Classification

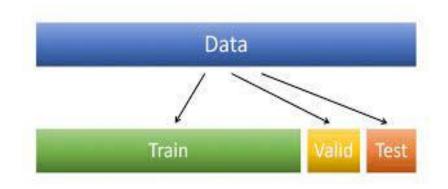
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## Methodological Approaches for the Sentiment Analysis

- 1) Techniques based on the Lexicon Dictionary (Sentix, ecc): we assign some scores to some workds. Features are extracted words from sentences within the text and they are assigned to one score which will define the sentiment of the whole sentence. Features are not chosen from a model but by a domain expert.
- 2) Techniques based on the Machine Learning: the features needed to assign a sentiment class are extracted automatically by a Machine Learning (ML) / Deep Learning (DL) modelwhich is trained on a Training Set.

word	pos	neg	polarity	intensity
riforma	0.125	0	1	0.125
fallimento	0.021	0.375	-0.929	0.376
dat	0.063	0.104	-0.312	0.121
disoccupazione	0	0.625	-1	0.625
giovanil	0.125	0	1	0.125
aumento	0.208	0.083	0.516	0.224

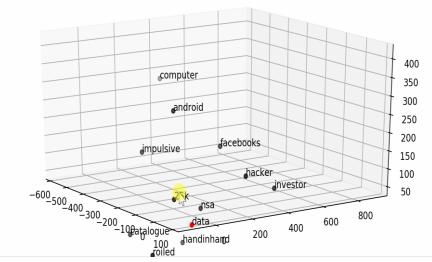


## **BERT - Bidirectional Encoder Representations from Transformers**

- BERT is the state-of-art in Natural Language Processing of ML/DL models.
   It was created by the Google Al Language group in 2018 (Devlin, et al., 2018).
   It is mased on neural networks with attention mechanisms which are called Transformers. They are use multi-head attention in a bidirectional mode:
- Strong points of BERT:

1. Contextualized Word Embeddings, that is it recognizes words and its context

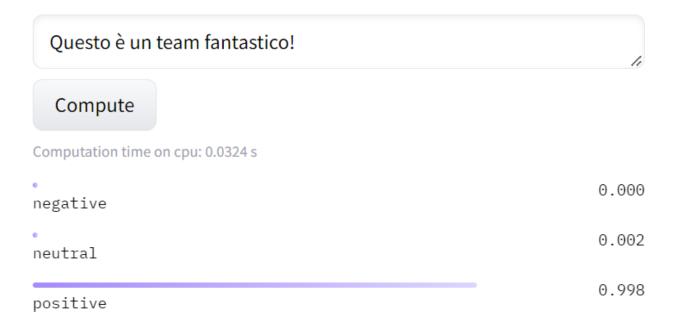
- 2. Many pre-trained models
- 3. More accurate syntactical / semantical analysis of the sentence structure



## Language Modeling by Bert and Hugging Face models

• Bert model, which we use, has been trained combining two datasets of tweets extracted from <u>Sentipolc EVALITA 2016</u> (Barbieri, et al., 2016). In total, the dataset is made of 45 thousands preprocessed tweets. This model has achieved 82% (state-of-art) of Test Set accuracy which is the 20% of the entire Dataset.

 It is possible to re-train with the technique "Transfer Learning".
 on new tweets labeled from us, achieving optimal results.

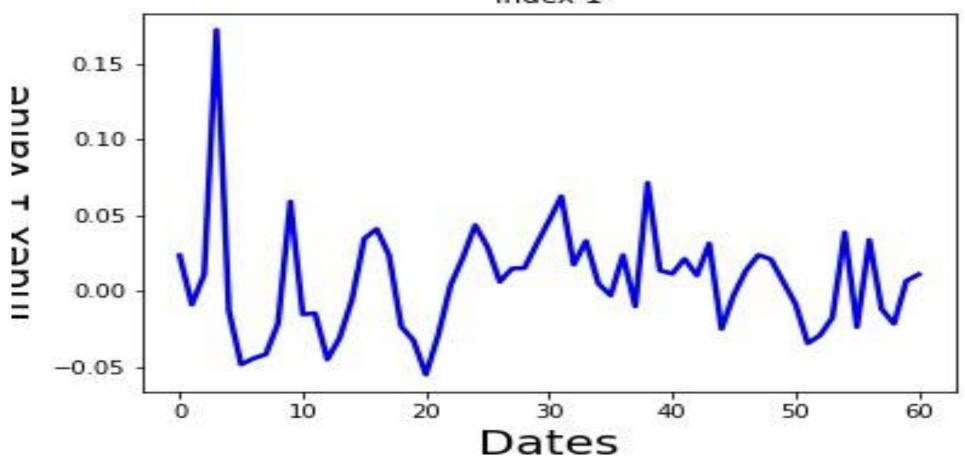


#### **Results: Index 1**

5

$$Index \ 1 = \frac{N_p - N_n}{Tot}$$

#### Index 1



#### References

Devlin, J., Chang, M. W., Lee, K., & Toutanova, K. (2018). Bert: Pre-training of deep bidirectional transformers for language understanding. *arXiv preprint arXiv:1810.04805*.

https://huggingface.co/neuraly/bert-base-italian-cased-sentiment

Barbieri, F., Basile, V., Croce, D., Nissim, M., Novielli, N., & Patti, V. (2016, December). Overview of the evalita 2016 sentiment polarity classification task. In *Proceedings of third Italian conference on computational linguistics (CLiC-it 2016)* & fifth evaluation campaign of natural language processing and speech tools for Italian. Final Workshop (EVALITA 2016).