



Universität Hamburg
DER FORSCHUNG | DER LEHRE | DER BILDUNG

Alexander Panchenko

**FROM UNSUPERVISED INDUCTION OF
LINGUISTIC STRUCTURES FROM TEXT
TOWARDS APPLICATIONS IN DEEP
LEARNING**

In close collaboration with ...



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GRAPHS
~~**PUNKS**~~
NOT DEAD

In collaboration with ...

- **Andrei Kutuzov**
- **Eugen Ruppert**
- **Fide Marten**
- **Nikolay Arefyev**
- **Steffen Remus**
- **Martin Riedl**
- **Hubert Naets**
- **Maria Pelevina**
- **Anastasiya Lopukhina**
- **Konstantin Lopukhin**

Motivation

Deep Learning: everything is a vector



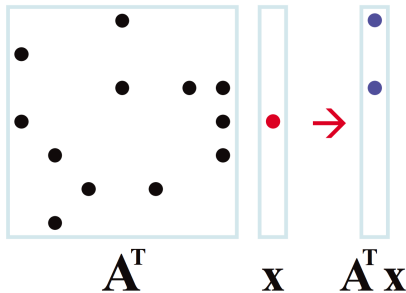
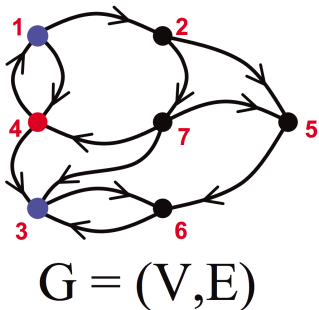
Levels of Linguistic Analysis

Image source: https://commons.wikimedia.org/wiki/File:Major_levels_of_linguistic_structure.svg

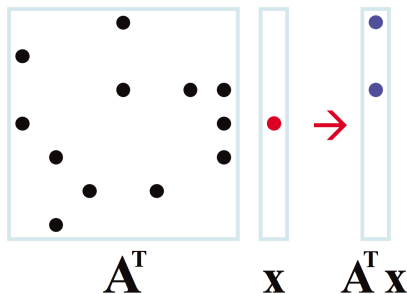
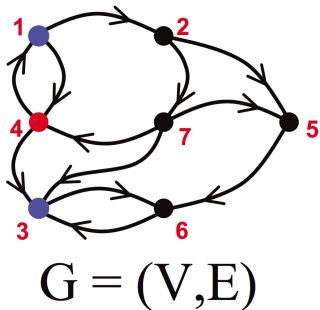
Linguistic Structures and Graphs

- (Written) language is a **symbolic system**

Graph Matrix Duality

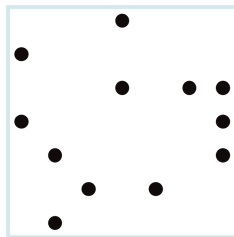
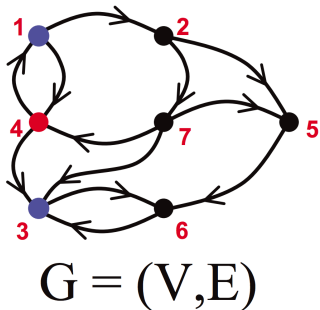


Graph Matrix Duality



- Adjacency matrix A is dual with the corresponding graph G .

Graph Matrix Duality



A^T



x



$A^T x$

- Adjacency matrix A is dual with the corresponding graph G .
- Vector matrix multiply $A^T x$ is dual with breadth-first search.

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- 3 Use the vector representations instead/in addition to word embedding the deep learning applications.
- 4 More complex structures could improve performance, but also provide better interpretability of the deep learning models.