

Inferring context specific PPI networks using unsupervised deep learning for text mining

What

INtERAcT is a method to extract interaction networks from unstructured text.

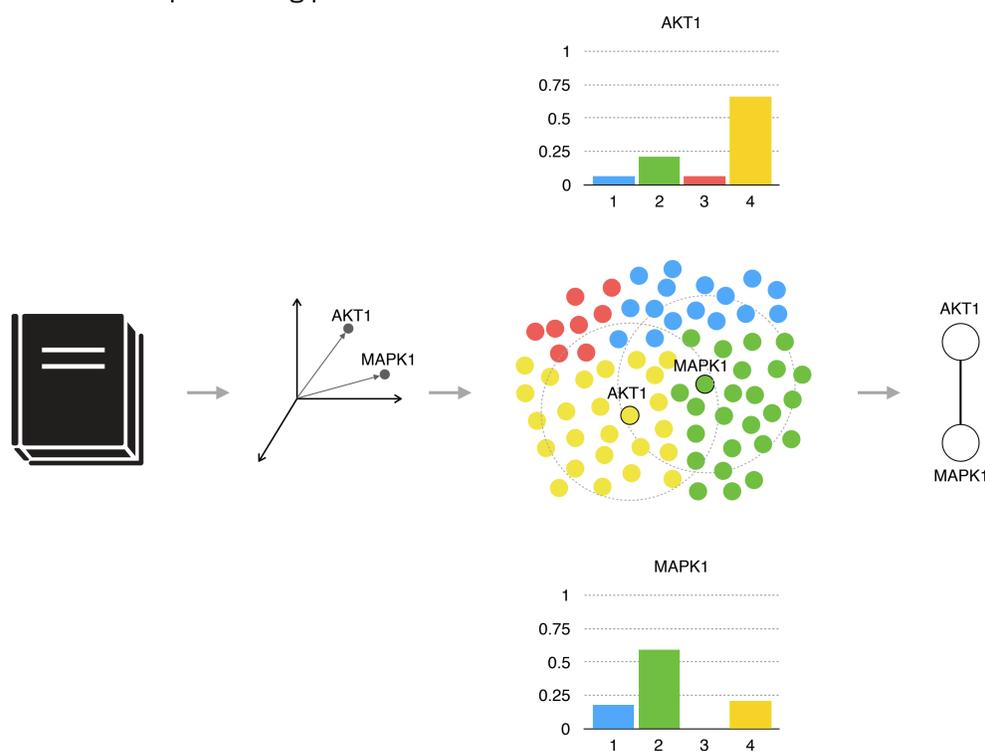
- Fully **unsupervised**
 - **no** need for heavy **manual curation**
 - **no** need for a **language model**
 - **no annotations**
- Context-specific networks

How

Words in a vocabulary are mapped into vectors in a continuous, high dimensional space. In this representation, words that share a similar context in the corpus are located in close proximity in the word embedding vector space.

INtERAcT (Interaction Network InfErrence from Vector RepresentATion of Words) exploits **word vectors** trained on a **context-specific** corpus and defines a metric to score confidence of interactions.

Our proposed metric is based on a **clustering** of the embedded space and the distributional properties of word neighbors. This scoring is derived from the **Jensen-Shannon divergence** between the neighbor distributions of the the words representing proteins.



tl;dr

1. Build a word embedding from context specific publications
2. INtERAcT will cluster embedded words and infer a network using neighbor distributions over clusters similarity
3. Profit

Why

As the number of scientific publications grows exponentially, search engines such as PubMed [<https://www.ncbi.nlm.nih.gov/pubmed>] provide an unprecedented amount of information in the form of **unstructured text**. Manual curation becomes infeasible.

Many approaches to **extract protein-protein interaction (PPI)** information from require feature engineering and expert-domain knowledge, hence preventing full automation.

Results

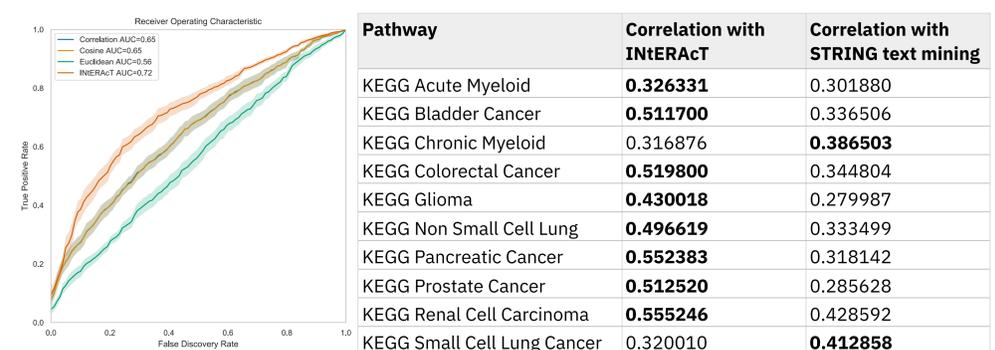
We built context specific word embeddings for ten cancer types, e.g. from publications returned when searching PMC [<https://www.ncbi.nlm.nih.gov/pmc>] for “non small cell lung cancer”.

As reference we used (human) PPIs from the STRING database [<https://string-db.org>]. STRING combines multiple types of evidence, including text-mining and experimental evidence.

INtERAcT outperforms the Euclidean, cosine and correlation distances which are alternative, commonly used metrics for word vector similarity scoring.

For eight of the ten cancer types INtERAcT shows superior rank correlation compared to the text mining PPI predictions from STRING (excluding the text-mining evidence from the ground truth reference).

We tested INtERAcT using only abstract vs. full text and on a wide range of parameters for the embedding and scoring. Remarkably, INtERAcT performance is largely insensitive to the choice of embedding parameters.



Pathway	Correlation with INtERAcT	Correlation with STRING text mining
KEGG Acute Myeloid	0.326331	0.301880
KEGG Bladder Cancer	0.511700	0.336506
KEGG Chronic Myeloid	0.316876	0.386503
KEGG Colorectal Cancer	0.519800	0.344804
KEGG Glioma	0.430018	0.279987
KEGG Non Small Cell Lung	0.496619	0.333499
KEGG Pancreatic Cancer	0.552383	0.318142
KEGG Prostate Cancer	0.512520	0.285628
KEGG Renal Cell Carcinoma	0.555246	0.428592
KEGG Small Cell Lung Cancer	0.320010	0.412858

Context-specific interaction networks from vector representation of words
Matteo Manica, Roland Mathis, Joris Cadow and María Rodríguez Martínez
Nature Machine Intelligence 1(4), 181–190, 201

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INtERAcT

is open source and deployed on IBM Cloud as a web service.
Visit ibm.biz/interact to find all things related.

NONPRECISE

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