



# NLP APPLICATIONS

TEXT CLUSTERING

TEXT CLASSIFICATION

TEXT SUMMARISATION

MACHINE TRANSLATION

SEMANTIC SEARCH

SENTIMENT ANALYSIS

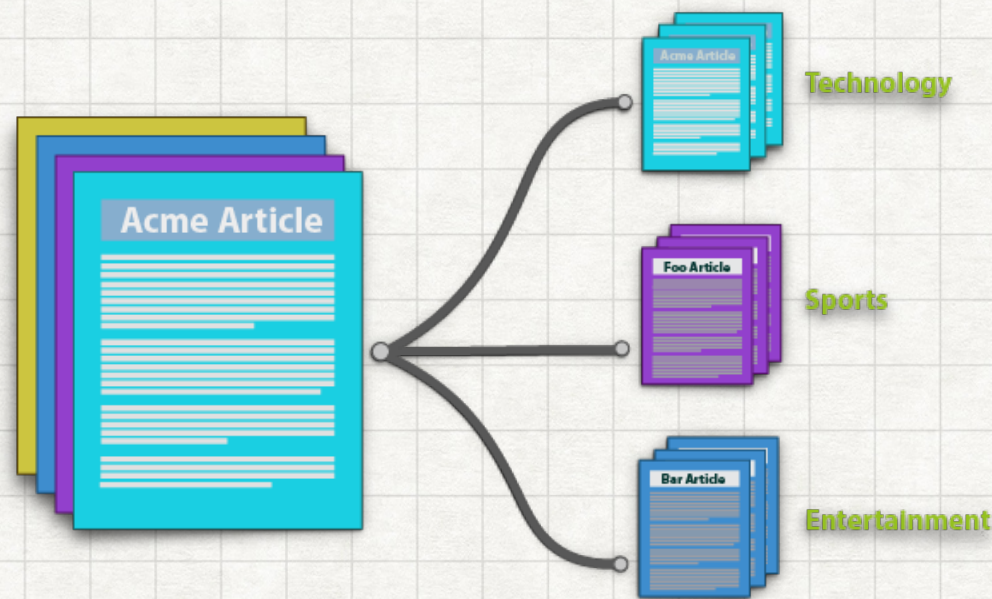
QUESTION ANSWERING

INFORMATION EXTRACTION





# NLP. TEXT CLASSIFICATION



**Document classification** or document categorization is a problem in library science, information science and computer science. The task is to assign a document to one or more classes or categories. This may be done "manually" or algorithmically.

## **Popular algorithms:**

1. Multinomial Naive Bayes
2. SVM
3. Neural Networks



# NLP. TEXT CLUSTERING



Document **clustering** (or **text clustering**) is the application of **cluster** analysis to textual documents. It has applications in automatic document organization, topic extraction and fast information retrieval or filtering.

## **Popular algorithms:**

1. k-Means
2. DBSCAN
3. Deep Learning



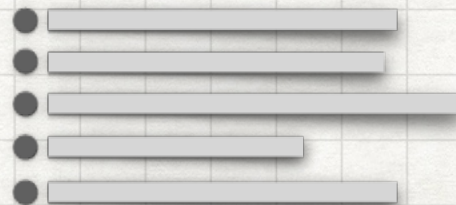


# NLP. TEXT SUMMARISATION



before

Summary



after

Automatic **summarization** is the process of shortening a **text** document with software, in order to create a summary with the major points of the original document. Technologies that can make a coherent summary take into account variables such as length, writing style and syntax.

**Popular algorithms:**

1. LDA
2. Deep Learning



# NLP. MACHINE TRANSLATION



MT performs simple substitution of words in one language for words in another, but that alone usually cannot produce a good translation of a text because recognition of whole phrases and their closest counterparts in the target language is needed. Solving this problem with corpus statistical, and neural techniques is a rapidly growing field that is leading to better translations, handling differences in linguistic typology, translation of idioms, and the isolation of anomalies

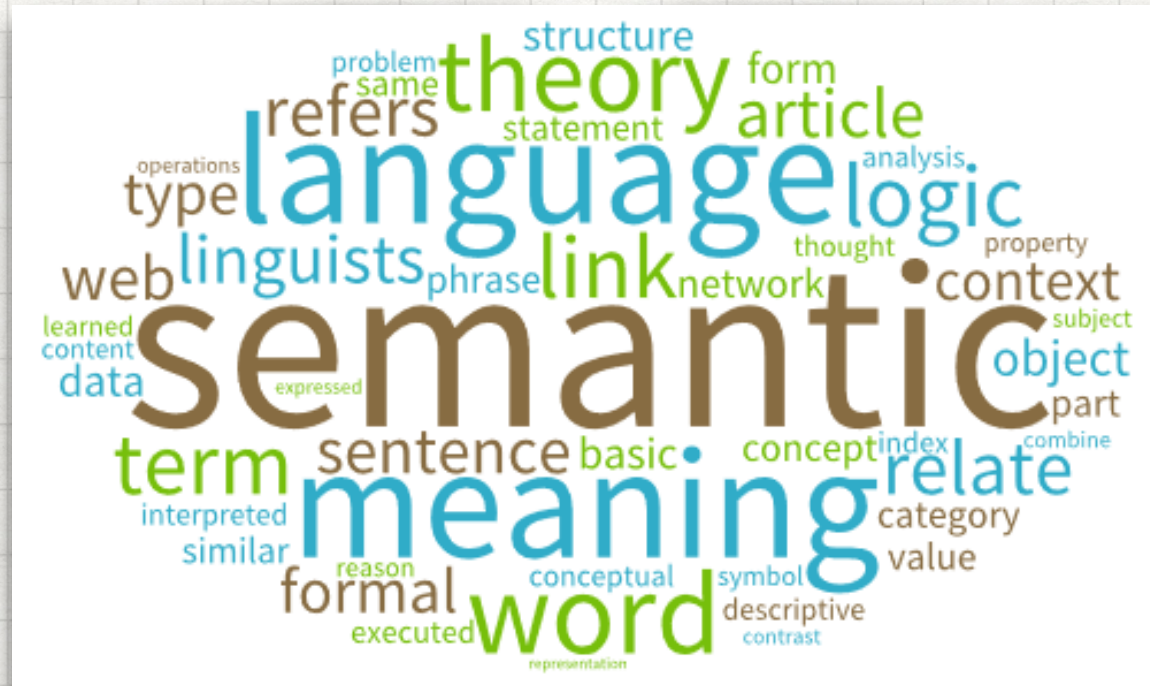
## **Algorithms:**

1. Rule based
2. Statistical methods
3. Encoder-Decoder





# NLP. SEMANTIC SEARCH



**Semantic search** seeks to improve **search** accuracy by understanding searcher intent and the contextual meaning of terms as they appear in the searchable dataspace, whether on the Web or within a closed system, to generate more relevant results.

## **Approaches:**

1. Entity Recognition
2. User context



# NLP. SENTIMENT ANALYSIS



**Sentiment Analysis** is the process of determining whether a piece of writing is positive, negative or neutral. It's also known as opinion mining, deriving the opinion or attitude of a speaker.

## **Algorithms:**

1. Lexicon-based
2. Machine Learning (SVM)
3. Deep Learning (RNN, LSTM)



# NLP. QUESTION ANSWERING



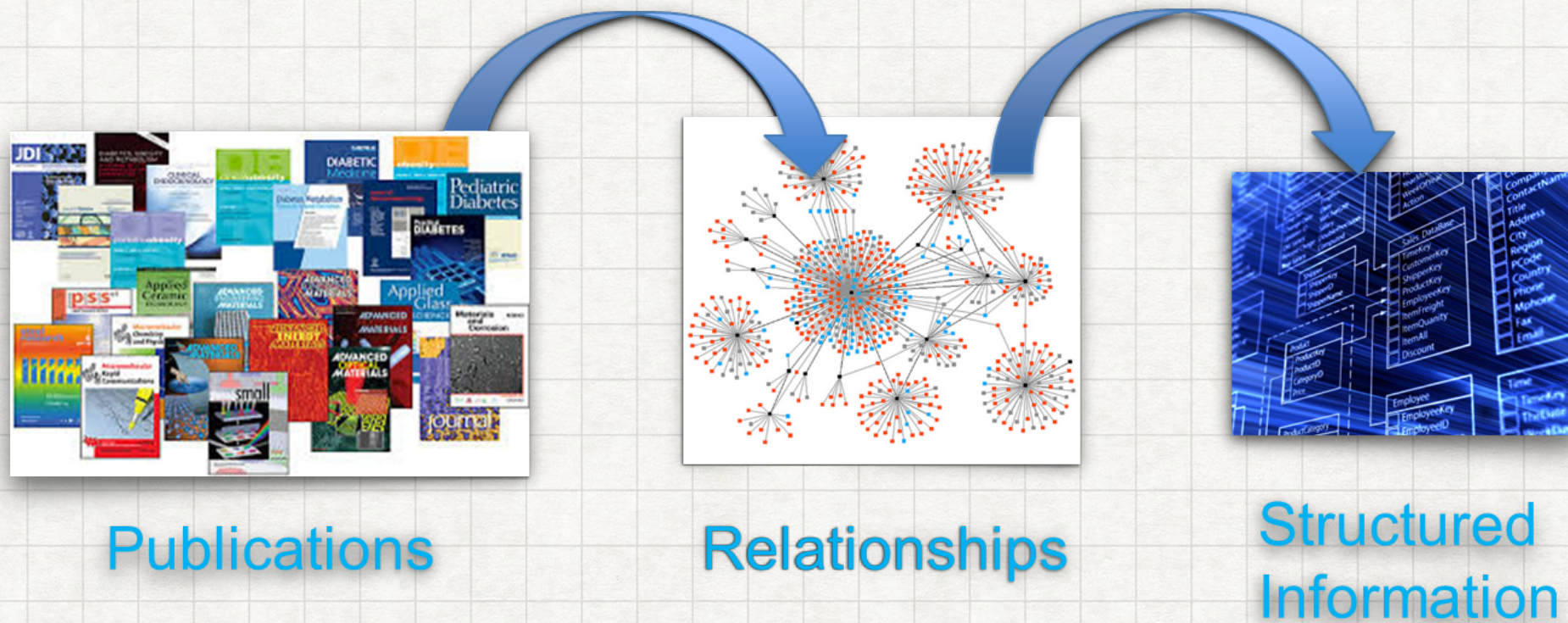
**Question answering (QA)** is a computer science discipline within the fields of information retrieval and natural language processing (NLP), which is concerned with building systems that automatically **answer questions** posed by humans in a natural language.

## **Algorithms:**

1. Rule based
2. Machine Learning
3. Deep Learning



# NLP. INFORMATION EXTRACTION



Information extraction is the task of automatically extracting structured information from unstructured and/or semi-structured machine-readable documents.





# NLP TOOLS

1. MORPHOLOGICAL ANALYZER
2. POS TAGGER
3. STEMMER
4. PARSERS
5. NAMED ENTITY RECOGNIZER





# NLP. STEMMER

**Stemmers** remove morphological affixes from words, leaving only the word stem.

**bananas -> banana**

**cats -> cat**

**dogs -> dog**

**flies -> fli**

**How about “flies” -> fly?**





## NLP. MORPHOLOGICAL ANALYZER

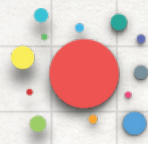
**Lemmatization** usually refers to doing things properly with the use of a vocabulary and morphological analysis of words, normally aiming to remove inflectional endings only and to return the base or dictionary form of a word, which is known as the lemma .

flies -> fly

went -> go

am, are, is -> be





## Stemming vs Lemmatization

→ token normalization

*a.k.a. token "regularization"*

*(although that is technically the wrong wording)*

### • Stemming

- ▶ produced by "**stemmers**"
- ▶ produces a word's "stem"

- ▶ am → am
- ▶ the going → the go
- ▶ having → hav

- ▶ fast and simple (pattern-based)

#### ▶ **Snowball; Lovins; Porter**

- `nltk.stem.*`

### • Lemmatization

- ▶ produced by "**lemmatizers**"
- ▶ produces a word's "lemma"

- ▶ am → be
- ▶ the going → the going
- ▶ having → have

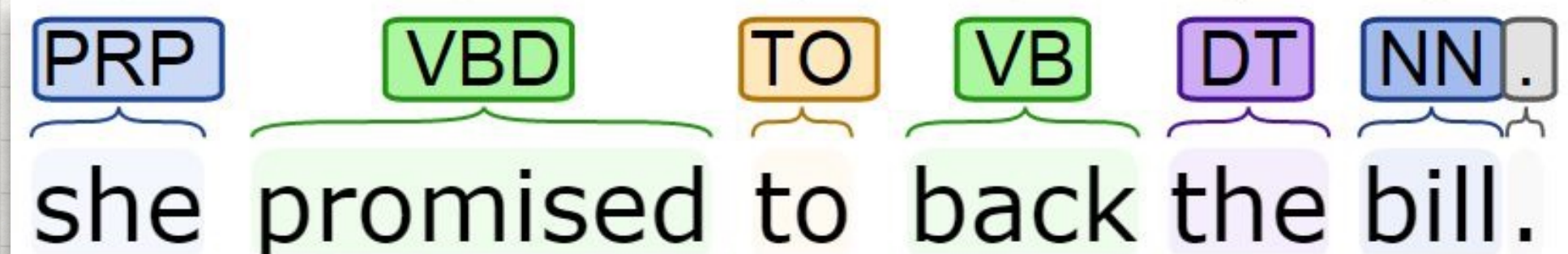
- ▶ requires: a dictionary and PoS

#### ▶ **LemmaGen; morpha**

- `nltk.stem.wordnet`

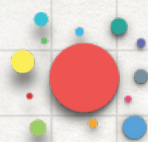


## NLP. POS TAGGER



A **Part-Of-Speech Tagger (POS Tagger)** is a piece of software that reads text in some language and assigns parts of speech to each word (and other token), such as noun, verb, adjective, etc., although generally computational applications use more fine-grained **POS** tags like 'noun-plural'.





# NLP. POS TAGGER

## Brown/Penn Treebank tags

| Tag  | Description           | Example                |
|------|-----------------------|------------------------|
| CC   | Coordin. Conjunction  | <i>and, but, or</i>    |
| CD   | Cardinal number       | <i>one, two, three</i> |
| DT   | Determiner            | <i>a, the</i>          |
| EX   | Existential 'there'   | <i>there</i>           |
| FW   | Foreign word          | <i>mea culpa</i>       |
| IN   | Preposition/sub-conj  | <i>of, in, by</i>      |
| JJ   | Adjective             | <i>yellow</i>          |
| JJR  | Adj., comparative     | <i>bigger</i>          |
| JJS  | Adj., superlative     | <i>wildest</i>         |
| LS   | List item marker      | <i>1, 2, One</i>       |
| MD   | Modal                 | <i>can, should</i>     |
| NN   | Noun, sing. or mass   | <i>llama</i>           |
| NNS  | Noun, plural          | <i>llamas</i>          |
| NNP  | Proper noun, singular | <i>IBM</i>             |
| NNPS | Proper noun, plural   | <i>Carolinas</i>       |
| PDT  | Predeterminer         | <i>all, both</i>       |
| POS  | Possessive ending     | <i>'s</i>              |
| PP   | Personal pronoun      | <i>I, you, he</i>      |
| PP\$ | Possessive pronoun    | <i>your, one's</i>     |
| RB   | Adverb                | <i>quickly, never</i>  |
| RBR  | Adverb, comparative   | <i>faster</i>          |
| RBS  | Adverb, superlative   | <i>fastest</i>         |
| RP   | Particle              | <i>up, off</i>         |

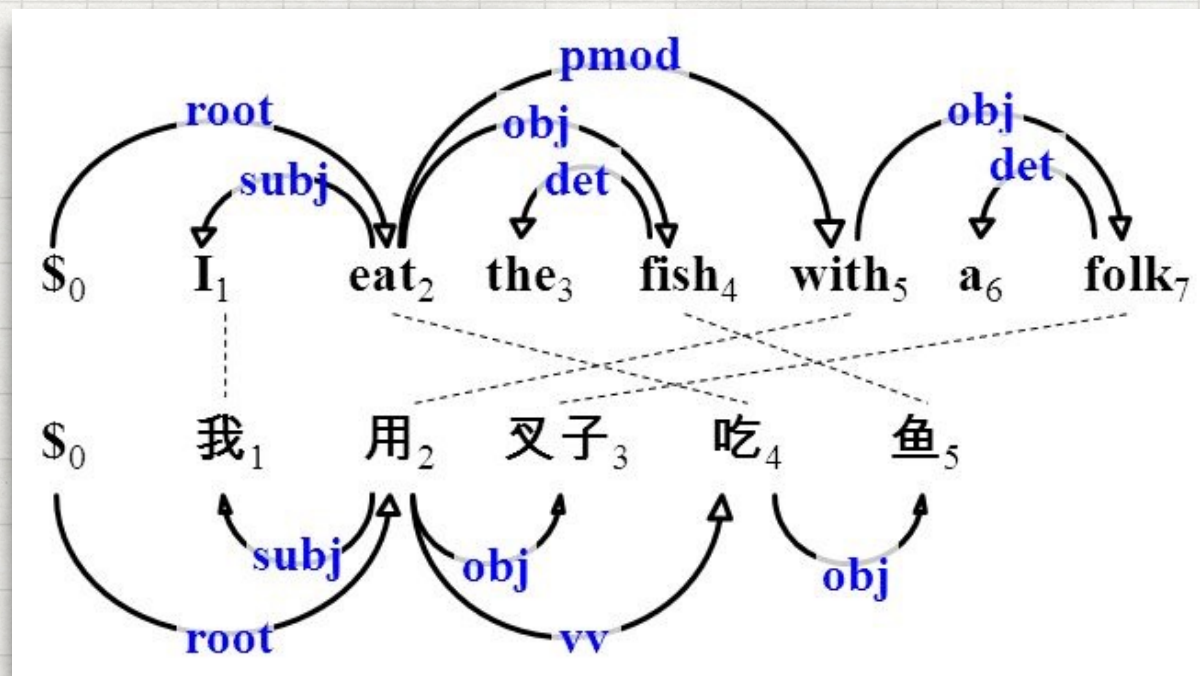
| Tag  | Description           | Example                 |
|------|-----------------------|-------------------------|
| SYM  | Symbol                | <i>+, %, &amp;</i>      |
| TO   | "to"                  | <i>to</i>               |
| UH   | Interjection          | <i>ah, oops</i>         |
| VB   | Verb, base form       | <i>eat</i>              |
| VBD  | Verb, past tense      | <i>ate</i>              |
| VBG  | Verb, gerund          | <i>eating</i>           |
| VCN  | Verb, past participle | <i>eaten</i>            |
| VBP  | Verb, non-3sg pres    | <i>eat</i>              |
| VBZ  | Verb, 3sg pres        | <i>eats</i>             |
| WDT  | Wh-determiner         | <i>which, that</i>      |
| WP   | Wh-pronoun            | <i>what, who</i>        |
| WP\$ | Possessive wh-        | <i>whose</i>            |
| WRB  | Wh-adverb             | <i>how, where</i>       |
| \$   | Dollar sign           | <i>\$</i>               |
| #    | Pound sign            | <i>#</i>                |
| "    | Left quote            | <i>(' or ")</i>         |
| "    | Right quote           | <i>(' or ")</i>         |
| (    | Left parenthesis      | <i>( [, (, {, &lt;)</i> |
| )    | Right parenthesis     | <i>( ], ), }, &gt;)</i> |
| ,    | Comma                 | <i>,</i>                |
| .    | Sentence-final punc   | <i>(. ! ?)</i>          |
| :    | Mid-sentence punc     | <i>(: ; ... - -)</i>    |



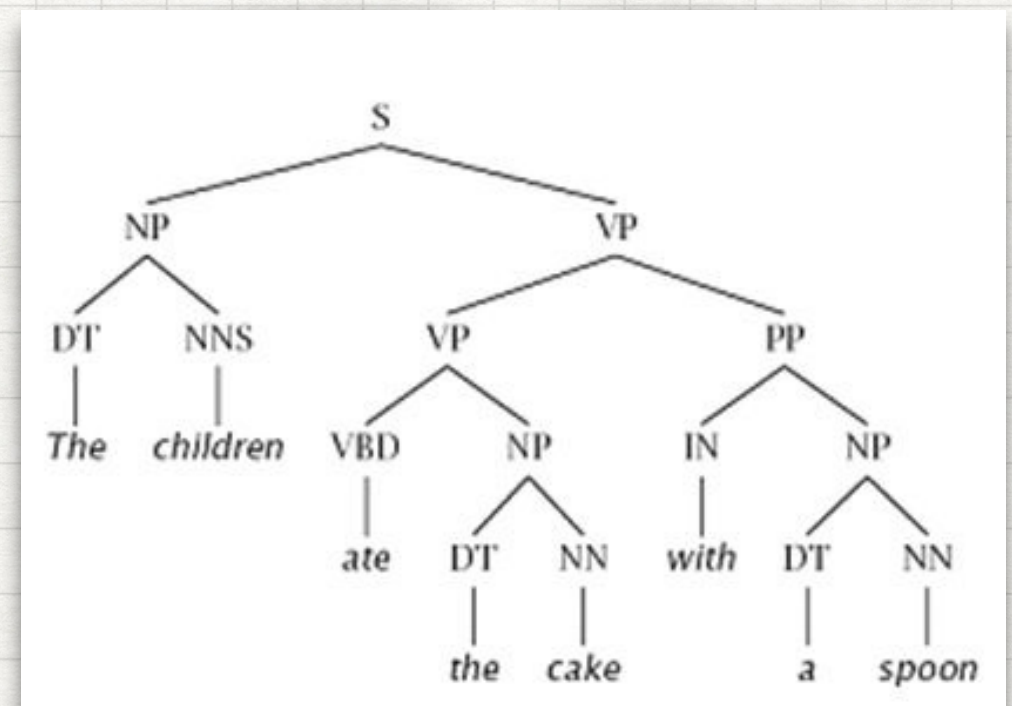


A natural language parser is a program that works out the grammatical **structure of sentences**, for instance, which groups of words go together (as "phrases") and which words are the **subject** or **object** of a verb.

## Dependency tree



## Constituency tree







# NLP. NAMED ENTITY RECOGNIZER

**Named-entity recognition (NER)** (also known as **entity identification**, **entity chunking** and **entity extraction**) is a subtask of **information extraction** that seeks to locate and classify **named entities** in text into pre-defined categories such as the names of persons, organizations, locations, expressions of times, quantities, monetary values, percentages, etc.

In **1917**, **Einstein** applied the general theory of relativity to model the large-scale structure of the universe. He was visiting the **United States** when **Adolf Hitler** came to power in **1933** and did not go back to **Germany**, where he had been a professor at the **Berlin Academy of Sciences**. He settled in the **U.S.**, becoming an American citizen in **1940**. On the eve of World War II, he endorsed a letter to President **Franklin D. Roosevelt** alerting him to the potential development of "extremely powerful bombs of a new type" and recommending that the **U.S.** begin similar research. This eventually led to what would become the **Manhattan Project**. Einstein supported defending the Allied forces, but largely denounced using the new discovery of nuclear fission as a weapon. Later, with the British philosopher **Bertrand Russell**, **Einstein** signed the **Russell-Einstein Manifesto**, which highlighted the danger of nuclear weapons. Einstein was affiliated with the **Institute for Advanced Study** in **Princeton, New Jersey**, until his death in **1955**.

Tag colours:

**LOCATION** **TIME** **PERSON** **ORGANIZATION** **MONEY** **PERCENT** **DATE**