



The Frontier of Knowledge Embedding

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Road Map

- 1. Knowledge Graph Embedding (KGE) (**Fundamental Theory**).
- 2. Distantly Supervised Relation Extraction via Exploiting Embedded Knowledge (**Application**).
- 3. Open Question Answering via Leveraging Embedded Knowledge (**Application**).

Precursors

To catch the main points of this presentation, the audience need to know those basic knowledge:

- 1. Stochastic Gradient Descent (SGD).
- 2. Derivative Formula (Vector & Matrix).
- 3. Hinge Loss Function.
- 4. Margin-based Rank Loss.

Knowledge Graph Embedding (**Theory**)

- **Reference Article:**

- *Translating Embeddings for Modeling Multi-relational Data*

- **Download Link:**

- http://www.thespermwhale.com/jaseweston/papers/CR_paper_nips13.pdf

- **Key points:**

- Embedding **entities (h, t)** and **relationships (r)** of multi-relational data **(h, r, t)** in low-dimensional vector spaces.
- The intuition is the **hierarchical** and **in-reflexive** relation instances (h, r, t).
- The model $||h+r-t||$.
- The algorithm.

Distantly Supervised Relation Extraction with Embedded Knowledge (**Application**)

- **Reference Article:**

- *Connecting Language and Knowledge Bases with Embedding Models for Relation Extraction.*

- **Download Link:**

- <http://hal.archives-ouvertes.fr/docs/00/88/04/55/PDF/weston13emnlp.pdf>

- **Key points:**

- (Distantly) Weakly Supervised Relation Extraction.
- Relation-mention and-ship scoring function $S_{m2r}(\cdot)$
- Triplet scoring function $S_{(h,r,t)}$.
- The combined function.

Open Question Answering with Embedded Knowledge (**Application**)

Reference Article:

Open Question Answering with Weakly Supervised Embedding Models

Download Link:

<http://arxiv.org/pdf/1404.4326.pdf>

Key points:

Open Question Answering.
Training Corpus Generation.
Question-Triplet Similarity.

The Promising Further Work

- 1. **Continuous representation (Embedded Encoding)** of knowledge (which is traditionally logical formed.)
- 2. Easily **conducting similarity computing** (Semantic Computing).
- 3. However, how to encode the word, entity, relation or the others (questions) into the same embedding space without losing the paraphrase?