

Mining Knowledge Graphs from Text

WSDM 2018

JAY PUJARA AND SAMEER SINGH



Introducing Presenters



Jay Pujara: Research Scientist at USC/ISI



Sameer Singh: Assistant Professor at UCI

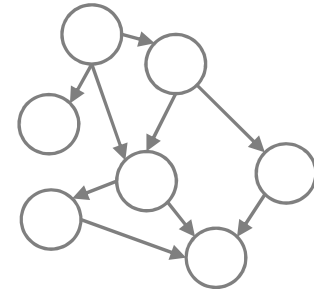
Tutorial Overview

<https://kgtutorial.github.io>

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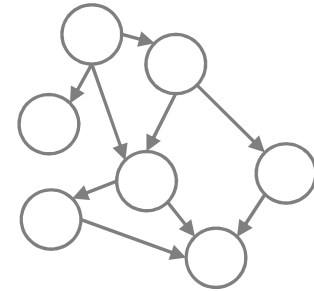
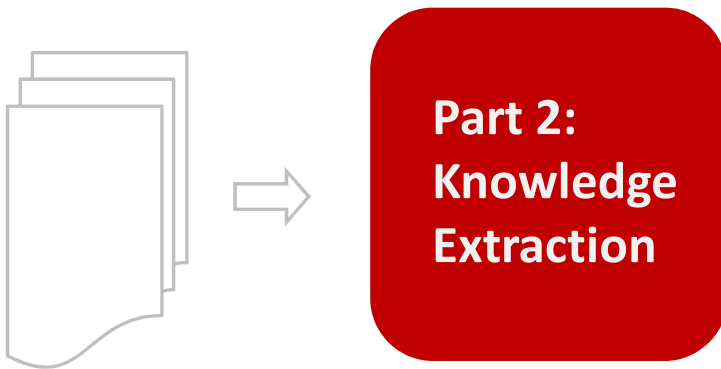
Part 1: Knowledge Graphs



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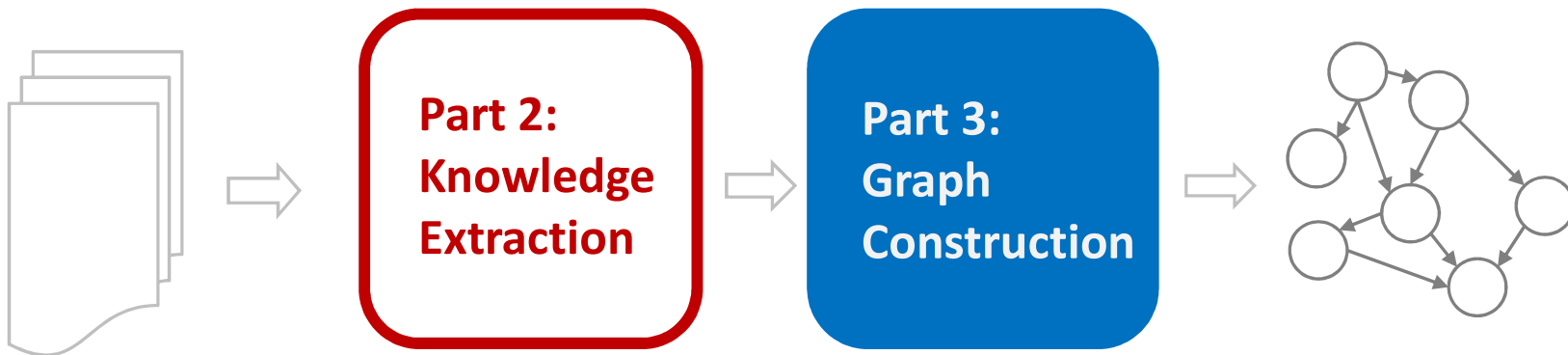
Part 1: Knowledge Graphs



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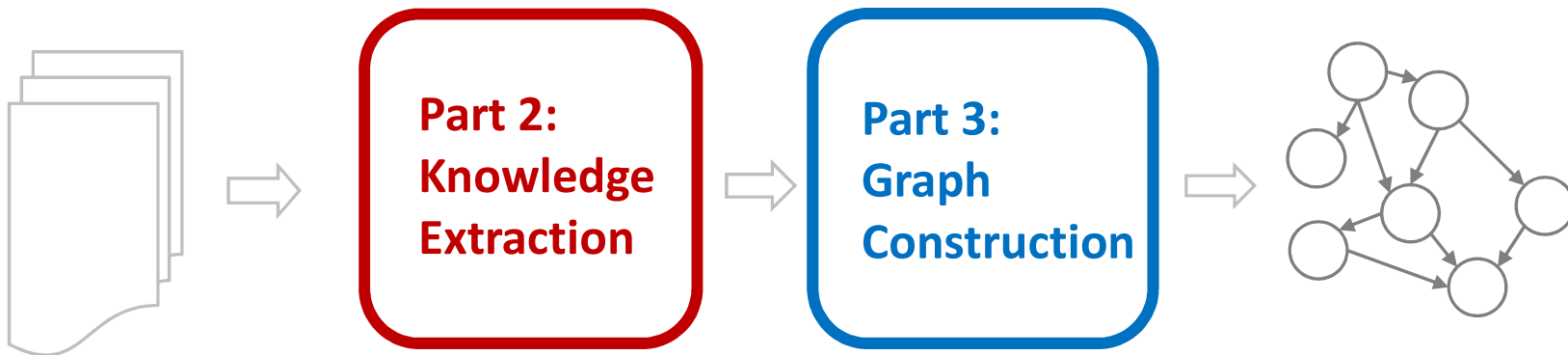
Part 1: Knowledge Graphs



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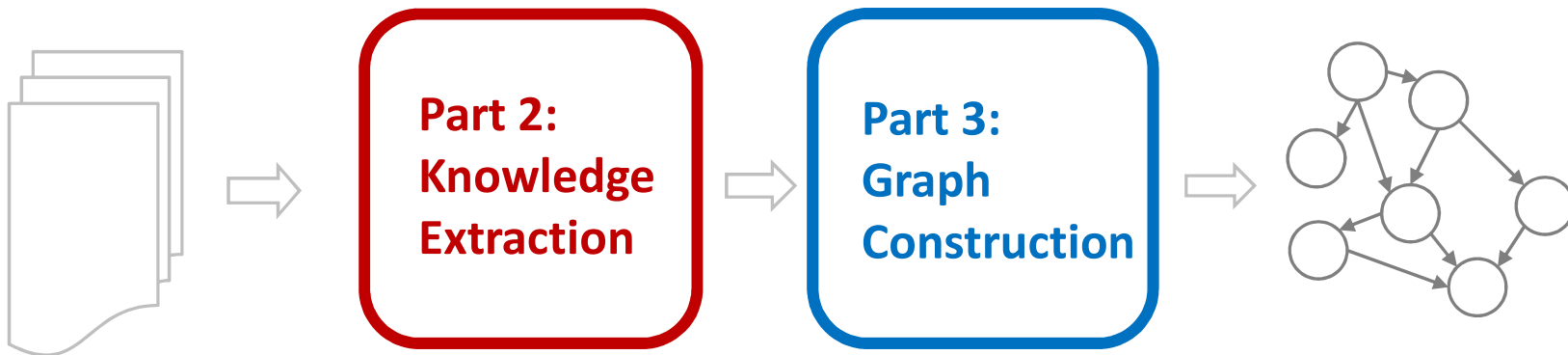


Part 4: Critical Analysis

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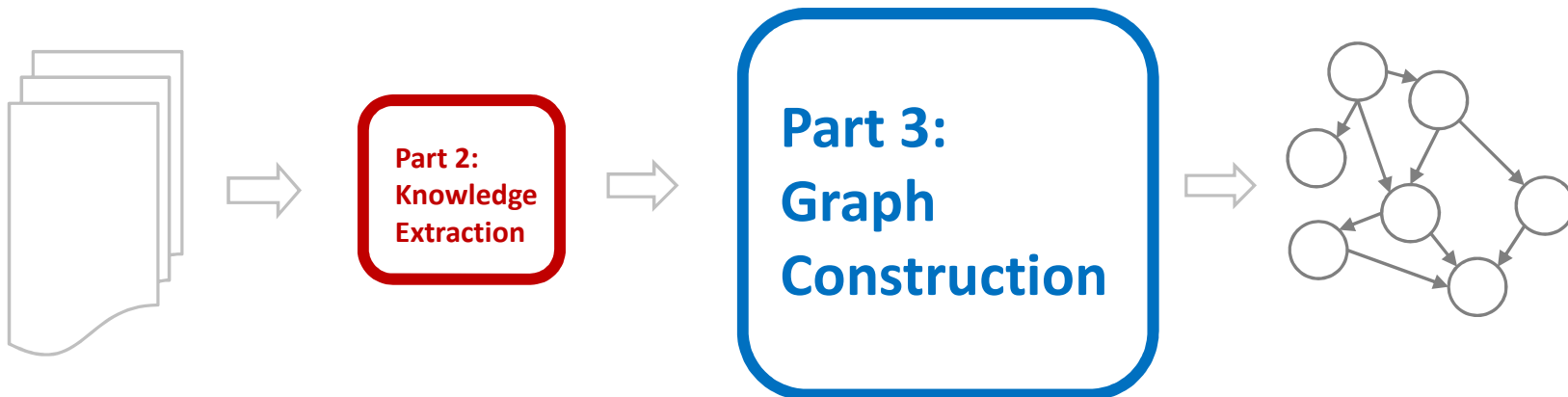


Part 4: Critical Analysis

Tutorial Overview

<https://kgtutorial.github.io>

Part 1: Knowledge Graphs



Part 4: Critical Analysis

Tutorial Outline

1. Knowledge Graph Primer

[Jay]



2. Knowledge Extraction Primer

[Jay]



3. Knowledge Graph Construction

a. Probabilistic Models

[Jay]



Coffee Break



b. Embedding Techniques

[Sameer]



4. Critical Overview and Conclusion

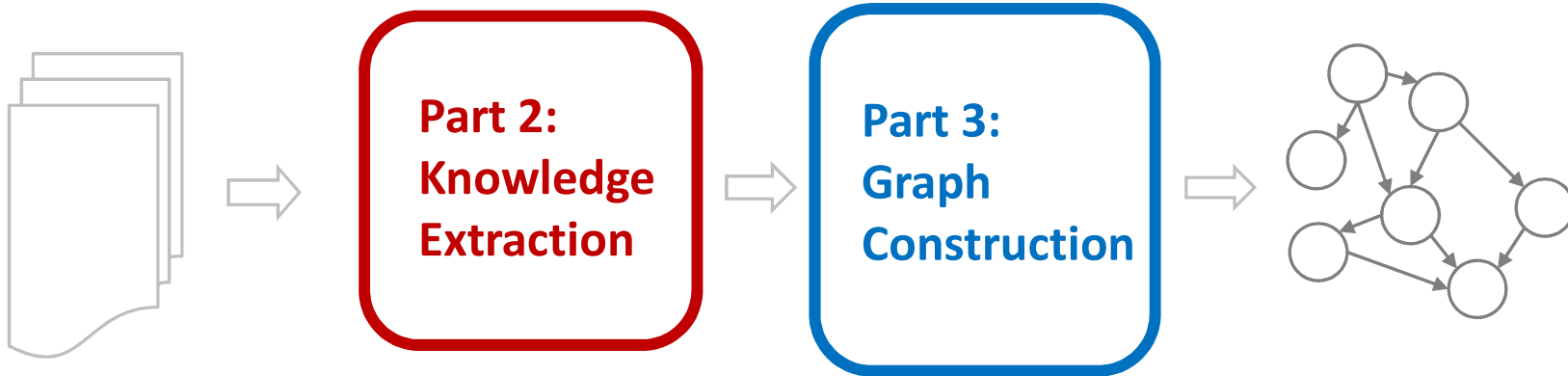
[Sameer]



What if I have a question?

Tutorial Overview

Part 1: Knowledge Graphs



Part 4: Critical Analysis

Knowledge Graph Primer

TOPICS:

WHAT IS A KNOWLEDGE GRAPH?

WHY ARE KNOWLEDGE GRAPHS IMPORTANT?

WHERE DO KNOWLEDGE GRAPHS COME FROM?

KNOWLEDGE REPRESENTATION CHOICES

PROBLEM OVERVIEW

Knowledge Graph Primer

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What is a knowledge graph?

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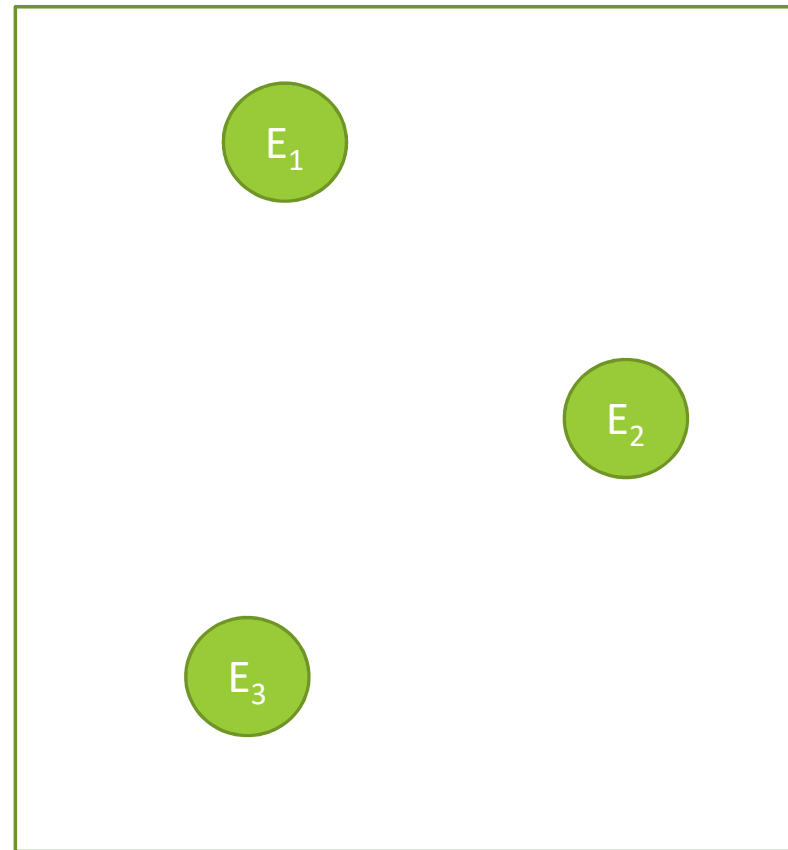
- Knowledge in graph form!

What is a knowledge graph?

- Knowledge in graph form!
- Captures entities, attributes, and relationships

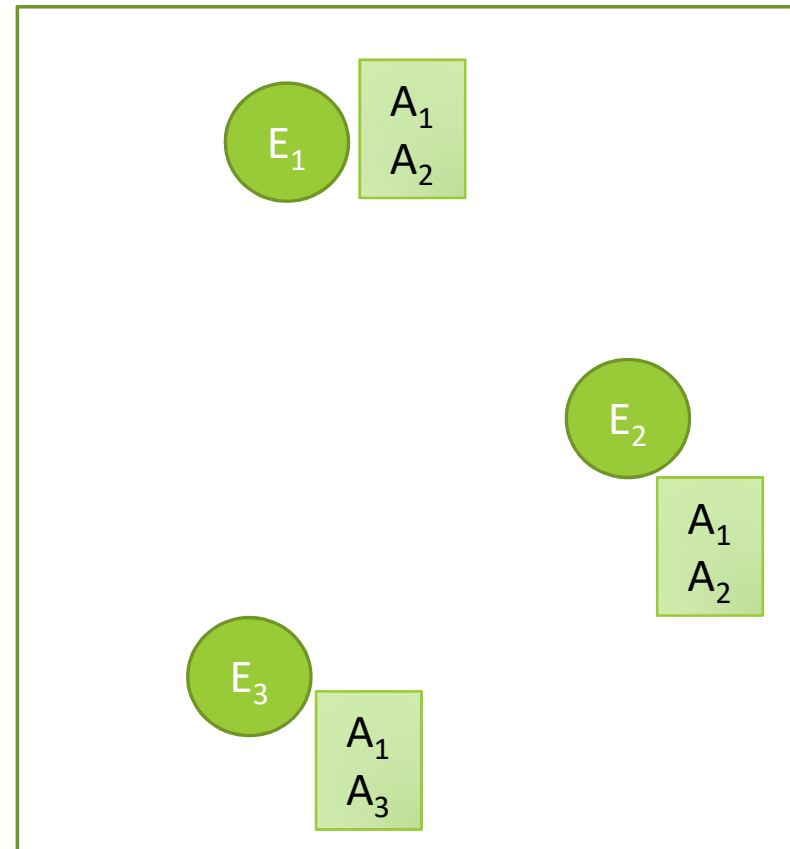
What is a knowledge graph?

- Knowledge in graph form!
- Captures entities, attributes, and relationships
- Nodes are entities



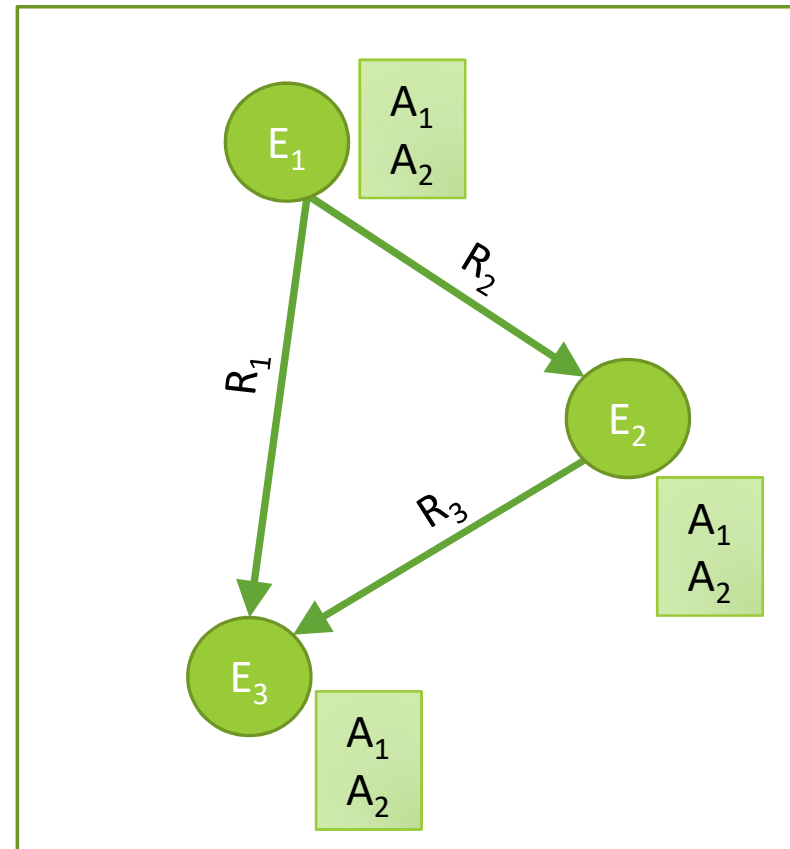
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- Nodes are entities
- Nodes are labeled with attributes (e.g., types)



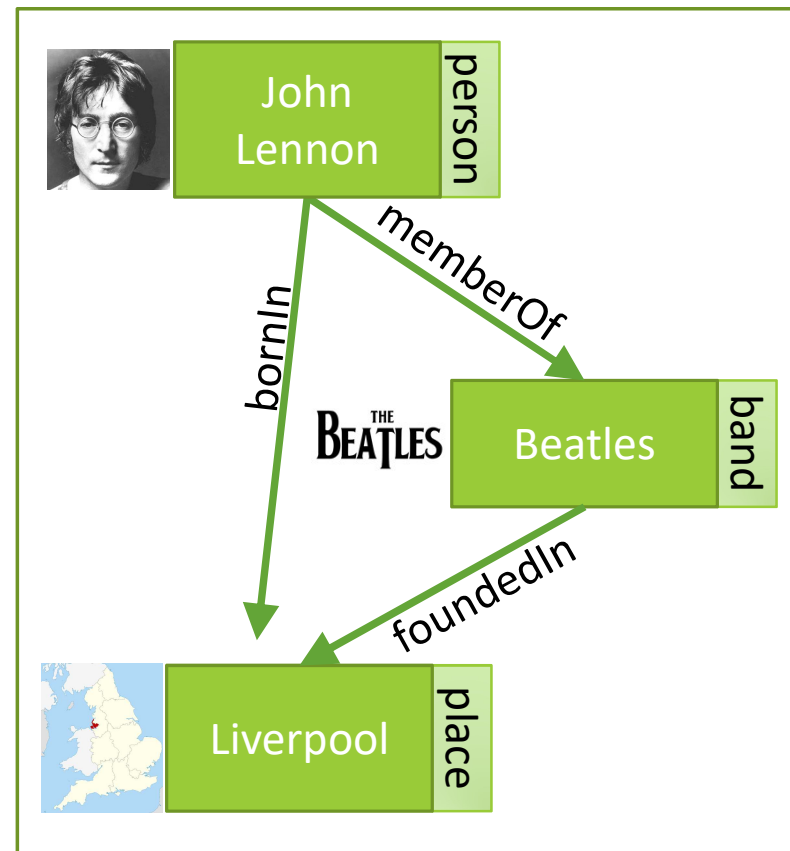
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- Knowledge in graph form!
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Example knowledge graph

- Knowledge in graph form!
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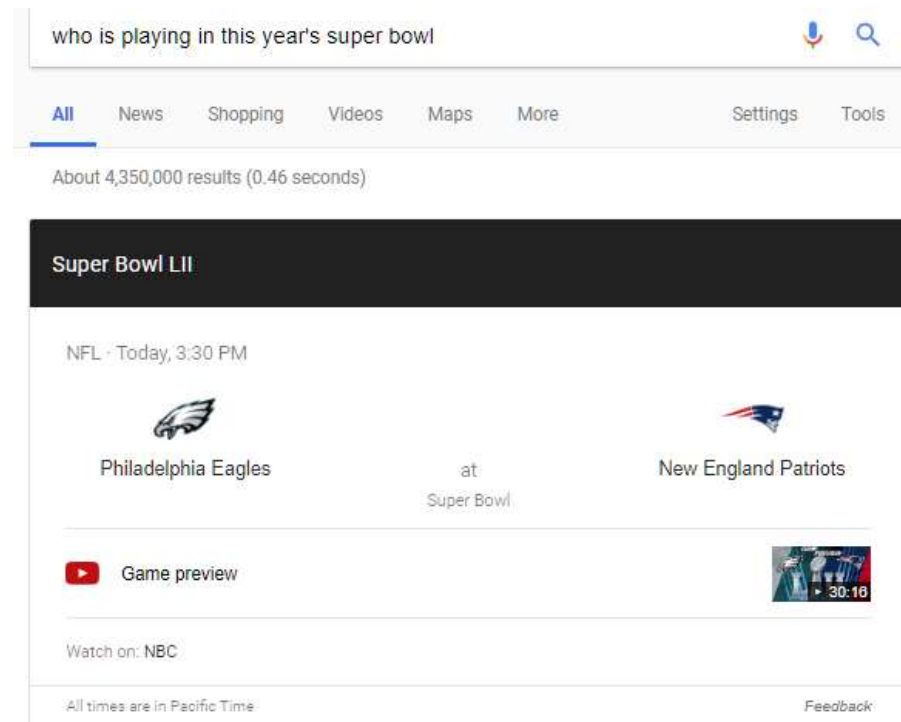
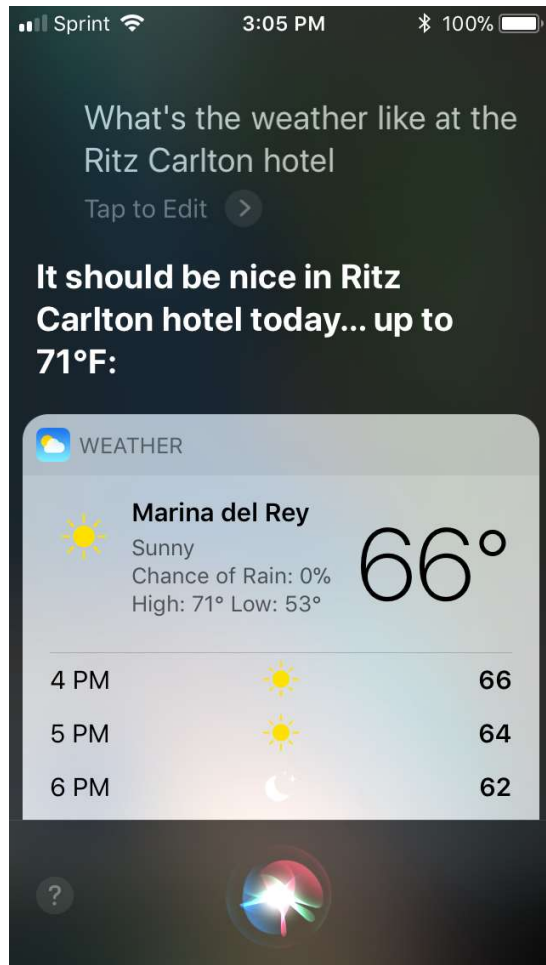
KNOWLEDGE REPRESENTATION CHOICES

PROBLEM OVERVIEW

Why knowledge graphs?

- Humans:
 - Combat information overload
 - Explore via intuitive structure
 - Tool for supporting knowledge-driven tasks
- AIs:
 - Key ingredient for many AI tasks
 - Bridge from data to human semantics
 - Use decades of work on graph analysis

Applications 1: QA/Agents



Applications 2: Decision Support

IBM Watson Knowledge Studio

2004-49-168A.txt

1 V1, a 1999 Toyota Camry, was traveling southbound in the second lane of a four-lane divided (seven lanes overall, divided by raised median), concrete roadway, approaching an intersection.

2 V2, a 2004 Mercedes S430, was northbound in the fourth lane of a four-lane, divided (seven lanes overall, divided by raised median), concrete roadway, about to turn left into westbound traffic at the same intersection.

3 As both vehicles entered the intersection, the front of V1 impacted the front of V2.

4 V1 rotated clockwise as V2 rotated counter-clockwise, and the left side of V1 impacted the right side of V2 in a sideslap configuration.

5 Both vehicles moved southwest to final rest.

6 Both vehicles were towed due to damage.

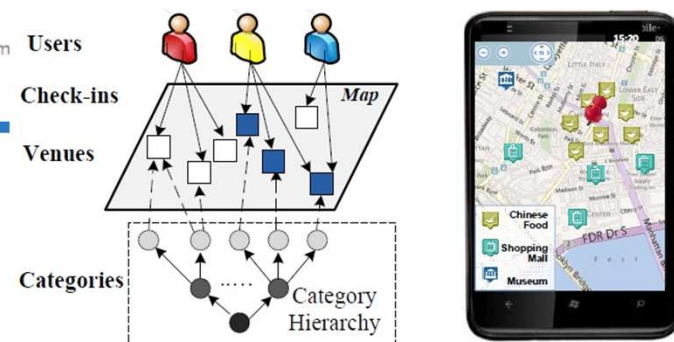
7 The unrestrained driver of V1 was hospitalized with foot and rib fractures as well as a liver laceration.

8 The restrained driver of V2 was treated and released with minor abrasion and contusion as well as a finger fracture.

9 The restrained front right passenger in V2 was pronounced brain dead two days later from brain injuries.

10 V1 was equipped with redesigned dual frontal air bags, which deployed.

Entity		Mention
Type	Subtype	Role
a	ACCIDENT_CAUSE	
o	ACCIDENT_OUTCOME	
-	CONDITION	
i	IMPACT	
f	MANUFACTURER	
m	MODEL	
y	MODEL_YEAR	
j	PART_OF_CAR	
p	PERSON	
s	STRUCTURE	
v	VEHICLE	



Applications 3: Fueling Discovery

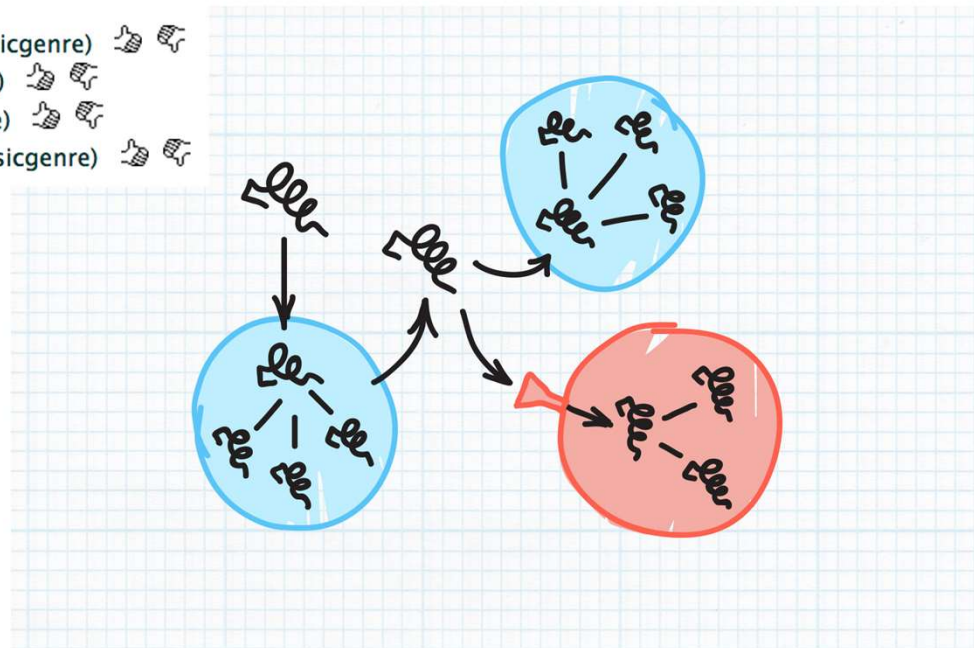
beatles (musicartist)

literal strings: [BEATLES](#), [Beatles](#), [beatles](#)

Help NELL Learn!

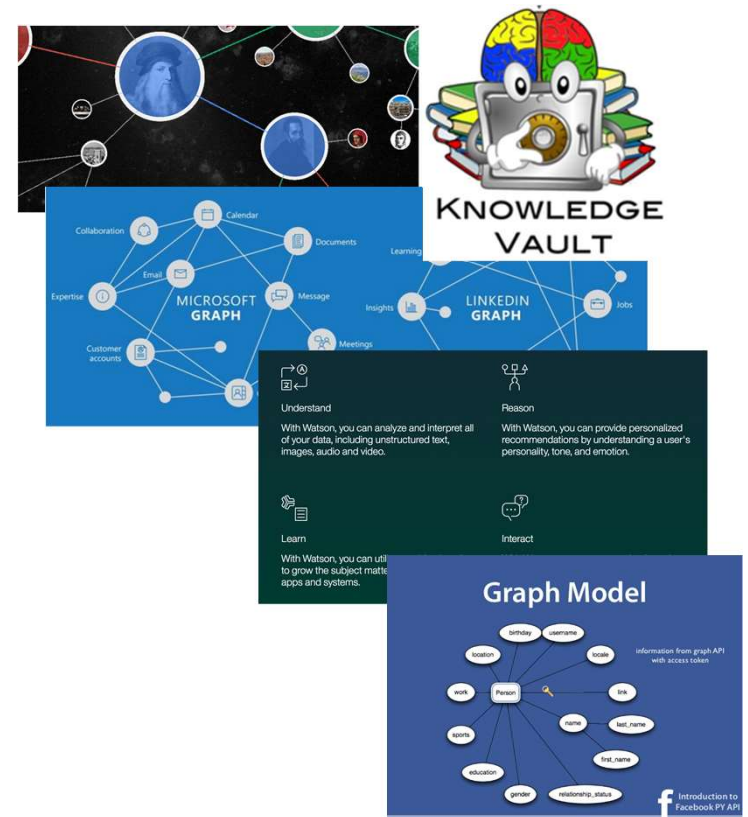
NELL wants to know if these be
If they are or ever were, click thumbs-up. Or

- [beatles](#) is a [musical artist](#) 👍 🗑️
- [beatles](#) is a musician in the [genre classic pop](#) (musicgenre) 👍 🗑️
- [beatles](#) is a musician in the [genre pop](#) (musicgenre) 👍 🗑️
- [beatles](#) is a musician in the [genre rock](#) (musicgenre) 👍 🗑️
- [beatles](#) is a musician in the [genre classic rock](#) (musicgenre) 👍 🗑️



Knowledge Graphs & Industry

- Google Knowledge Graph
 - Google Knowledge Vault
- Amazon Product Graph
- Facebook Graph API
- IBM Watson
- Microsoft Satori
 - Project Hanover/Literome
- LinkedIn Knowledge Graph
- Yandex Object Answer
- Diffbot, GraphIQ, Maana, ParseHub, Reactor Labs, SpazioDati



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Where do knowledge graphs come from?

Where do knowledge graphs come from?

- Structured Text
 - Wikipedia Infoboxes, tables, databases, social nets
- Unstructured Text
 - WWW, news, social media, reference articles

Beatles last live performance

Published: Thursday, January 26th 2017, 5:24 am PST

Updated: Monday, January 30th 2017, 4:06 am PST

Written by Jim Eftink, Producer [CONNECT](#)



(KFVS) - How about a little Beatles history.

It was on this date in 1969, the band performed their last live public performance.

Allan Williams, First Manager of the Beatles, Dies at 86

(Source: Stock Im) By ALLAN KOZINN DEC. 31, 2016

The Beatles
January 17 at 10:00am · 48

The Harrison family is proud to announce the release of George Harrison – The Vinyl Collection box set featuring all of George Harrison's solo studio albums in one collection for the first time.

GEORGE HARRISON - THE VINYL COLLECTION
Released on 24th February, 2017, the vinyl box set includes all twelve of George's studio albums with exact replicas of the original release track listing and artwork. Also included in the box set are George's classic live album Live in Japan (2L) ... [See More](#)

George Harrison - The Vinyl Collection - Released February 24th 2017
George Harrison - The Vinyl Collection, available to pre-order now with an exclusive & limited edition... [YOUTUBE.COM](#)

Like Love would 3K Top Comments

908 shares

Write a comment...

Jeffrey Smith What I would really be interested in is an "All Things Must Pass... Stripped Down" with just the basic tracks without Phil Spector's Wall of Sound. I'll bet it would sound really good and I would buy it in a heartbeat.
Like Reply · 8kg 31 · January 17 at 10:20am

17 Replies

Dave Standing I can just see the greedy Harrison family and the greedy music industry multi-millionaire big wigs rubbing their hands with glee once more whilst discussing various methods to make people buy their already bought and paid for record collections all a... See More
Like Reply · 8kg 26 · January 17 at 10:19am · Edited

30 Replies

View more comments 2 of 169

The Beatles
January 17 at 6:55am · 48

"Of very few individual songs can it be said, 'This changed the course of popular music.' 'A Day in the Life' is one such song." - Richard Havers

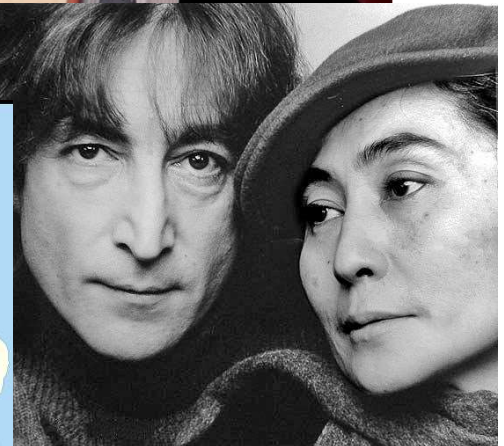
The Beatles - A Day In The Life
A Day in The Life The Beatles 1 Video Collection is Out Now. Get your copy here



anager of the Beatles in 1960, he sent them on a stint in Germany tagcraft. Press Association, via Associated Press

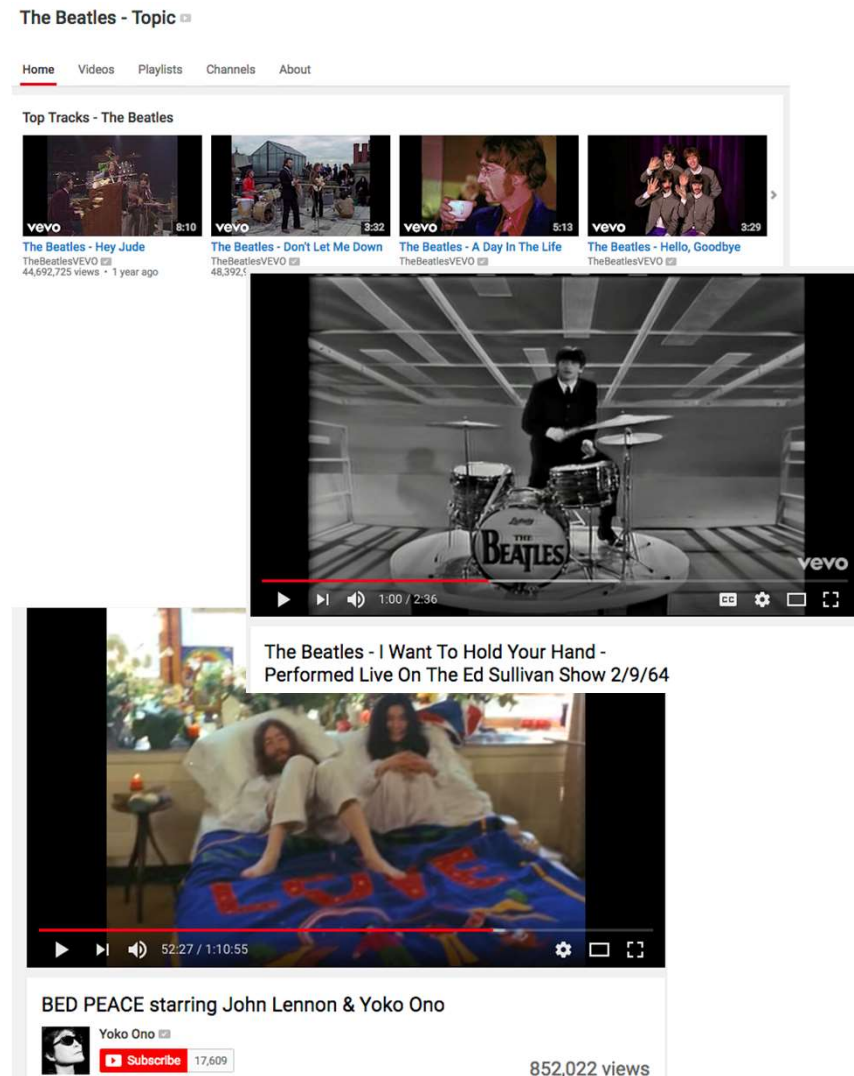
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- Images



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- Images
- Video
 - YouTube, video feeds



Knowledge Graph Primer

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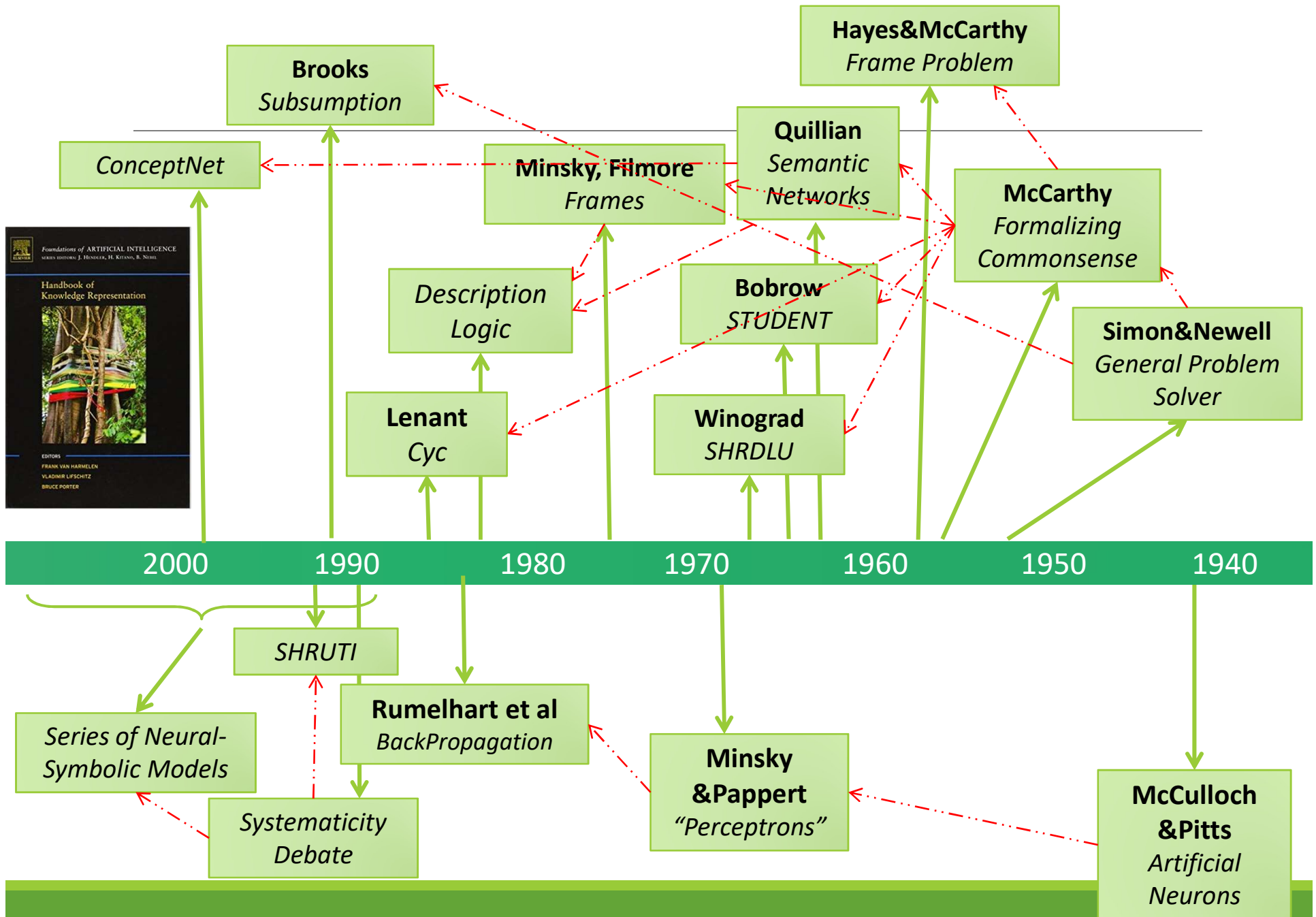
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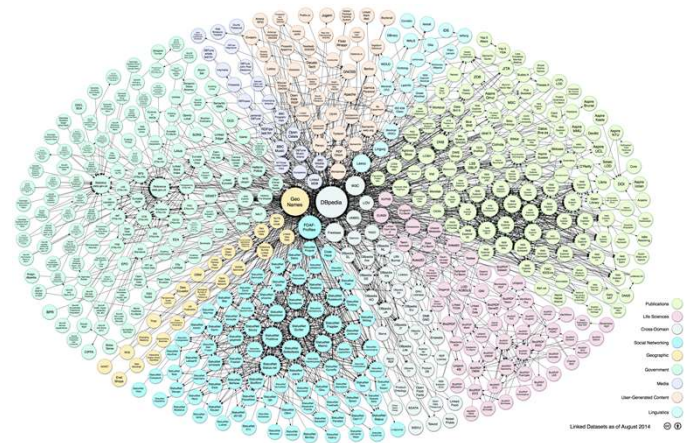


Knowledge Representation

- Decades of research into knowledge representation
- Most knowledge graph implementations use RDF triples
 - `<rdf:subject, rdf:predicate, rdf:object> : r(s,p,o)`
 - Temporal scoping, reification, and skolemization...
- ABox (assertions) versus TBox (terminology)
- Common ontological primitives
 - `rdfs:domain, rdfs:range, rdf:type, rdfs:subClassOf, rdfs:subPropertyOf, ...`
 - `owl:inverseOf, owl:TransitiveProperty, owl:FunctionalProperty, ...`

Semantic Web

- Standards for defining and exchanging knowledge
 - RDF, RDFa, JSON-LD, schema.org
 - RDFS, OWL, SKOS, FOAF
- Annotated data provide critical resource for automation
- Major weakness: annotate everything?



Information Extraction from Text

- Focus of this tutorial!
- Answer to the knowledge acquisition bottleneck
- Many challenges:
 - chunking
 - polysemy/word sense disambiguation
 - entity coreference
 - relational extraction

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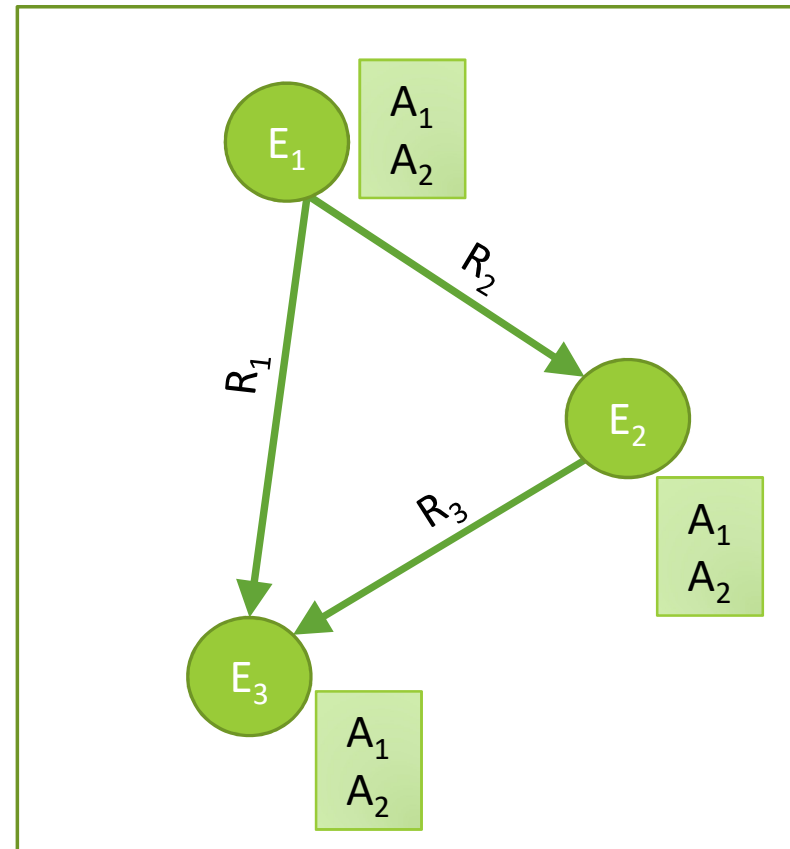
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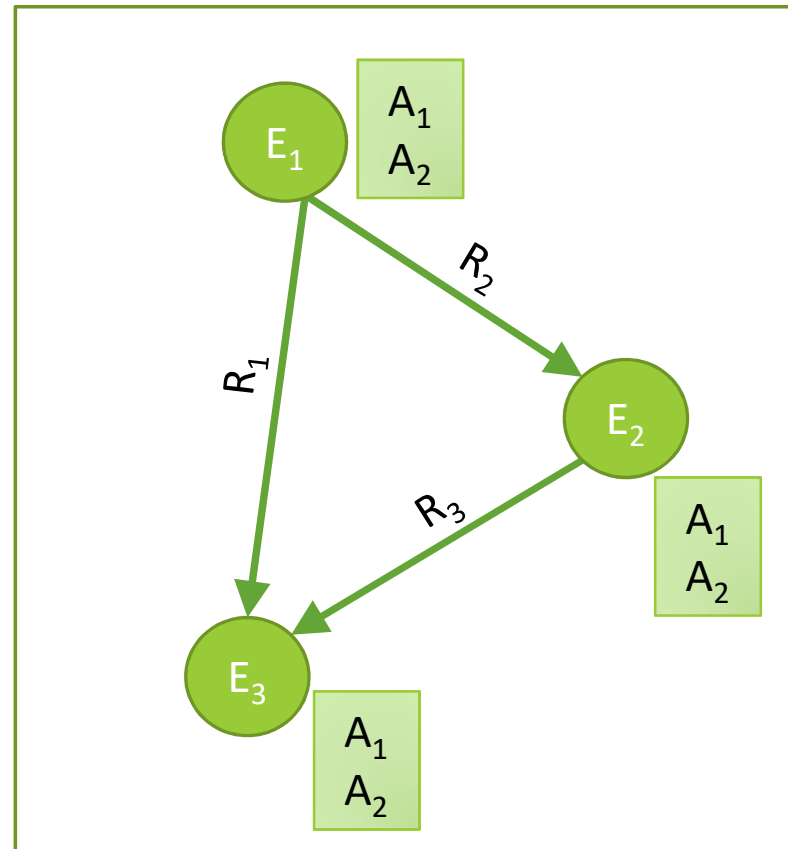
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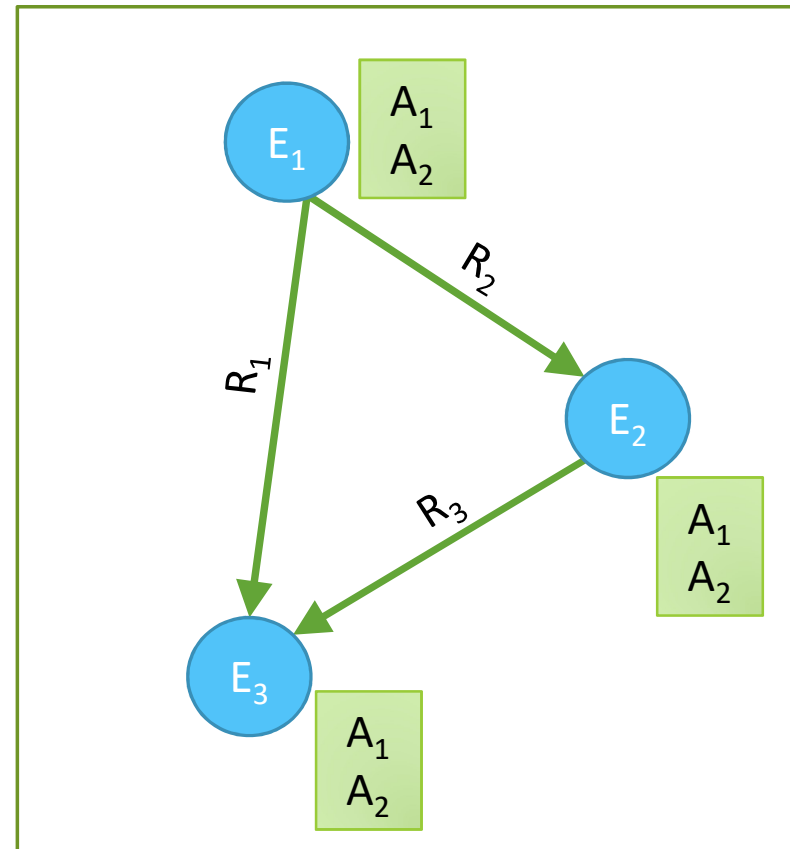


Basic problems



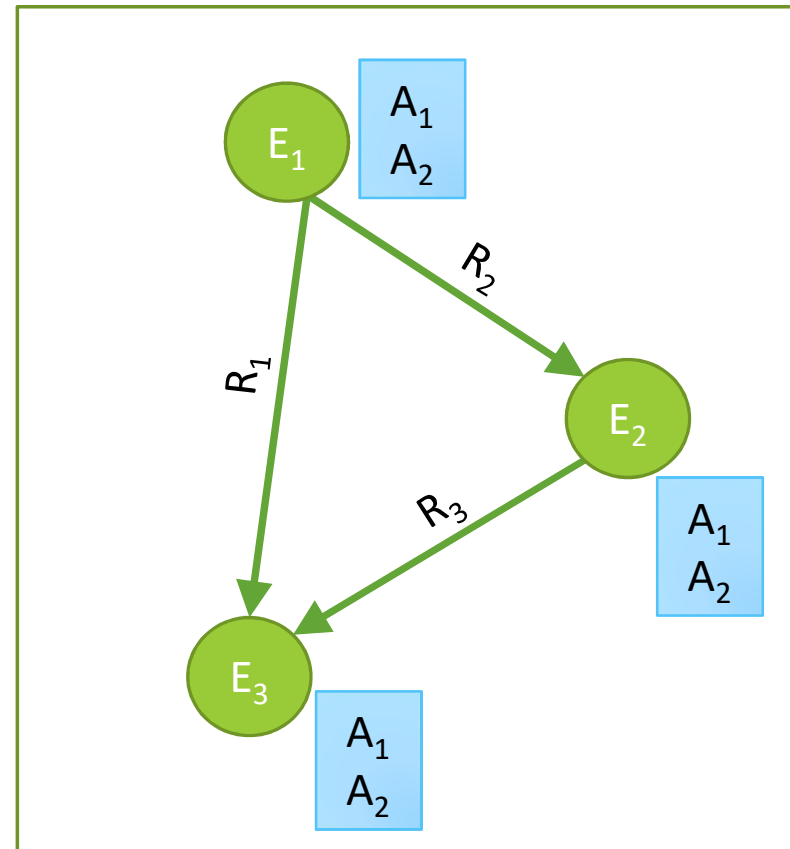
Basic problems

- **Who** are the entities (nodes) in the graph?



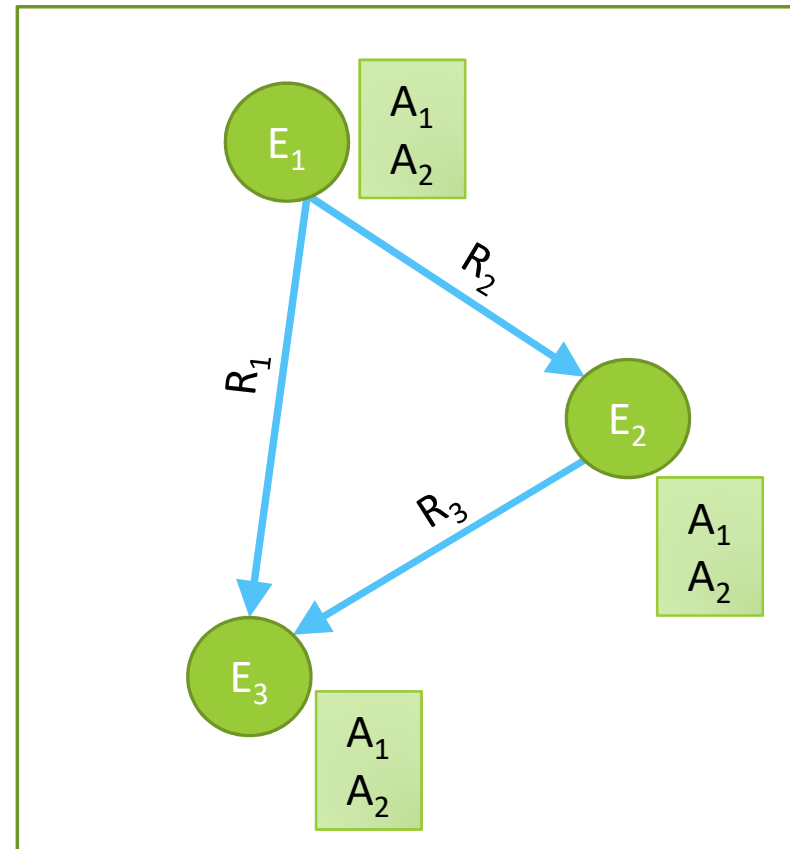
Basic problems

- **Who** are the entities (nodes) in the graph?
- **What** are their attributes and types (labels)?



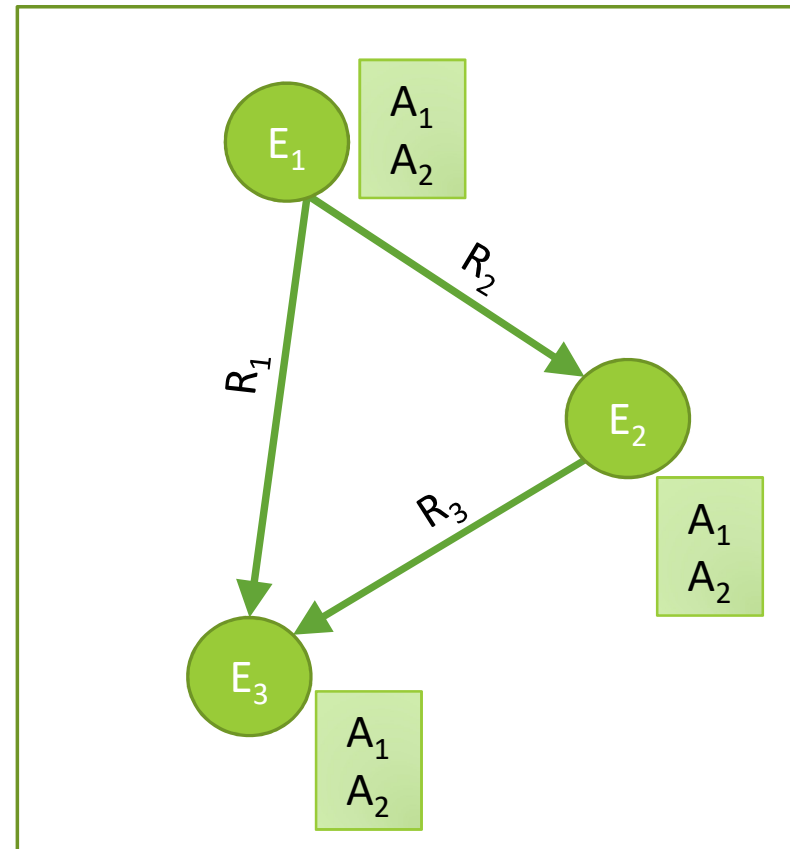
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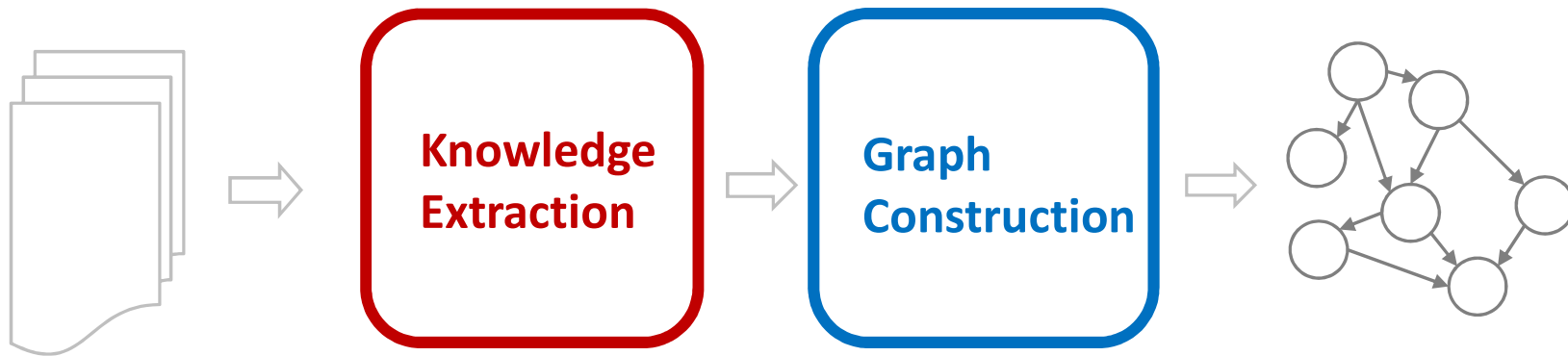


Basic problems

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Knowledge Graph Construction



Two perspectives

Knowledge Extraction

- **Who** are the entities (nodes) in the graph?
 - Named Entity Recognition
 - Entity Coreference
- **What** are their attributes and types (labels)?
 - Named Entity Recognition
- **How** are they related (edges)?
 - Relation Extraction
 - Semantic Role Labeling

Graph Construction

- **Who** are the entities (nodes) in the graph?
 - Entity Linking
 - Entity Resolution
- **What** are their attributes and types (labels)?
 - Collective Classification
- **How** are they related (edges)?
 - Link Prediction

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1. Knowledge Graph Primer

[Jay]



2. Knowledge Extraction Primer

[Jay]



3. Knowledge Graph Construction

a. Probabilistic Models

[Jay]



Coffee Break



b. Embedding Techniques

[Sameer]



4. Critical Overview and Conclusion

[Sameer]

