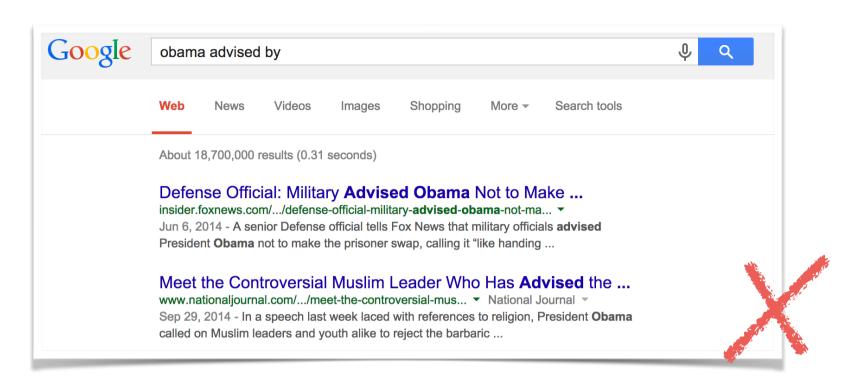
ReNoun

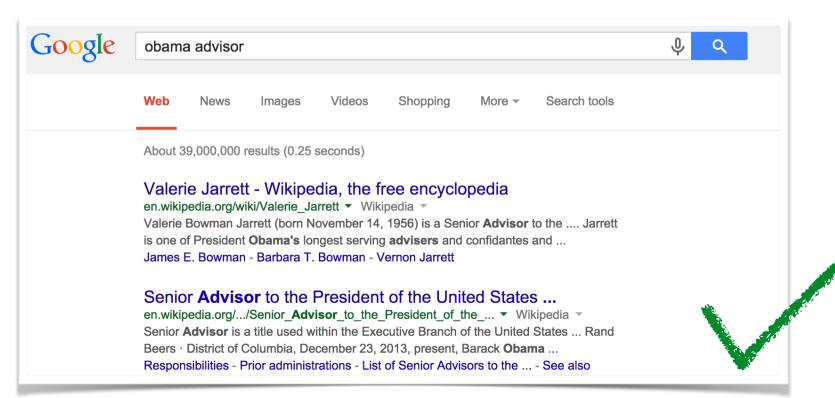
Fact Extraction for **Nominal** Attributes

Mohamed Yahya, Steven Whang, Rahul Gupta, and Alon Halevy



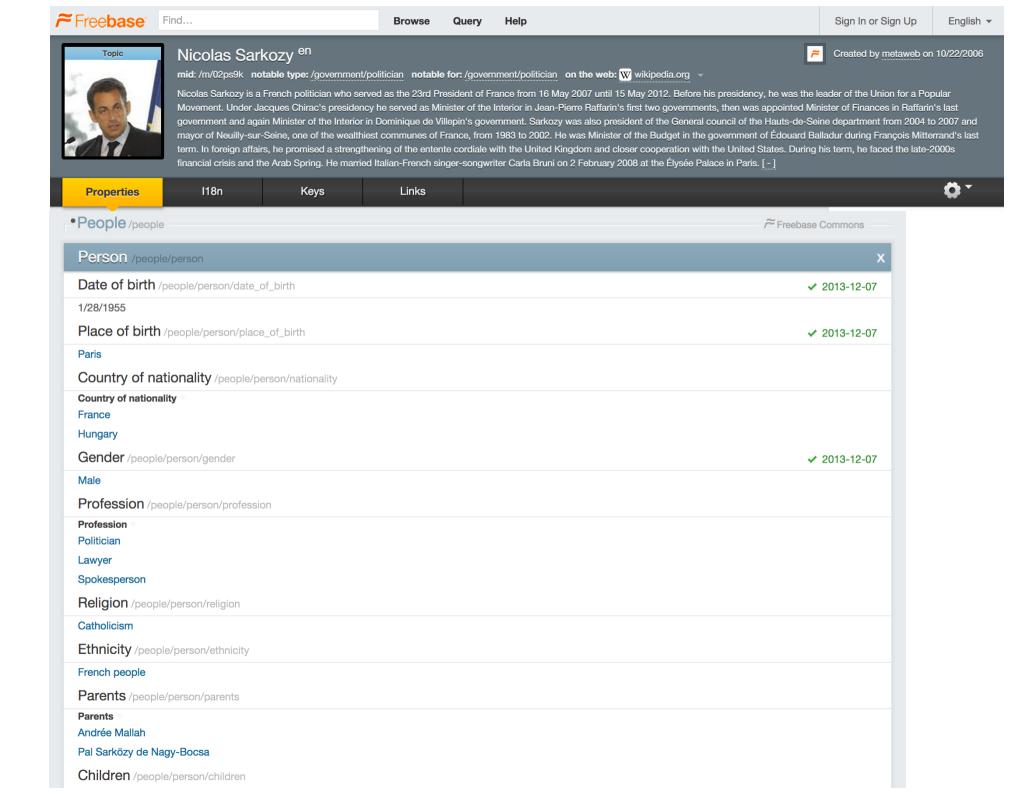
Nouns, Queries & Relations





Nouns as Attributes

KB	% Noun Attributes	% Verb Attributes
DBpedia	96	4
Freebase	97	3



Nouns as Attributes

KB	% Noun Attributes	% Verb Attributes
DBpedia	96	4
Freebase	97	3









Sign in

Web

News S

Shopping

Images

Videos

More ¬

Search tools





Nicolas Sarkozy > Ex-spouse

Marie-Dominique Culioli



Cécilia Attias



Cécilia Attias - Wikipedia, the free encyclopedia

en.wikipedia.org/wiki/Cécilia_Attias ▼ Wikipedia ▼

When her **husband** was a minister, Cécilia **Sarkozy** had an office next to his, ... announcement by stating that the **Sarkozys** had actually officially **divorced**. Background - Political life - Personal life - Cécilia Attias Foundation for ...

Cecilia Attias tells how friends tried to snap up **Sarkozy** after ...

www.dailymail.co.uk/.../Cecilia-Attias-tells-friends-tried-snap-...
Daily Mail
Oct 4, 2013 - Sarkozy's ex-wife reveals how 'several of her friends' dumped their husbands in desperate rush to become France's next First Lady after her ...

Sarkozy's ex-wife 'berated' Libya's Gaddafi - France 24

www.france24.com/.../20131003-france-cecilia-attias-sarkozy-... ▼ France 24 ▼ Oct 3, 2013 - The ex-wife of former French president Nicolas Sarkozy, Cécilia, claims in a new book that she delivered a blistering verbal attack on Libya's ...

Nicolas Sarkozy's 'shocking comments' lost him election ...

www.telegraph.co.uk > ... > Nicolas Sarkozy ▼ The Daily Telegraph ▼ Oct 3, 2013 - Nicolas Sarkozy displayed a "worrying impulsiveness" and his "shocking ... She also settles a few scores with her ex-husband, notably over the ...

Sarkozy's ex-wife talks of regret, scolding Gaddafi - The Local

www.thelocal.fr/.../cecilia-attias-**sarkozy**-gaddafi-libya-fouquets-royal

Oct 4, 2013 - Sho's been locked in a room with Libyan dictator Colonel Gaddafi, at whom

Nicolas Sarkozy

Former President of France

Nicolas Sarkozy is a French politician who served as the 23rd President of France from 16 May 2007 until 15 May 2012. Before his presidency, he was the leader of the Union for a Popular Movement. Wikipedia



Height: 5' 5" (1.65 m)

Presidential term: May 16, 2007 – May 15, 2012

Party: Union for a Popular Movement

Spouse: Carla Bruni (m. 2008), Cécilia Attias (m. 1996-2007), Marie-

Dominique Culioli (m. 1982–1996)

Siblings: Olivier Sarkozy, Guillaume Sarkozy, François Sarközy de

Nagy-Bocsa, Caroline Sarközy de Nagy-Bocsa











Sign in

Web

News Shopping

Images

Videos

More ▼

Search tools



entity



Nicolas Sarkozy > Ex-spouse

Marie-Dominique Culioli



Cécilia Attias



Cécilia Attias - Wikipedia, the free encyclopedia

en.wikipedia.org/wiki/Cécilia_Attias ▼ Wikipedia ▼

When her **husband** was a minister, Cécilia **Sarkozy** had an office next to his, ... announcement by stating that the **Sarkozys** had actually officially **divorced**. Background - Political life - Personal life - Cécilia Attias Foundation for ...

Cecilia Attias tells how friends tried to snap up **Sarkozy** after ...

www.dailymail.co.uk/.../Cecilia-Attias-tells-friends-tried-snap-... ▼ Daily Mail ▼ Oct 4, 2013 - **Sarkozy's ex-wife** reveals how 'several of her friends' dumped their husbands in desperate rush to become France's next First Lady after her ...

Sarkozy's ex-wife 'berated' Libya's Gaddafi - France 24

www.france24.com/.../20131003-france-cecilia-attias-sarkozy-... ▼ France 24 ▼ Oct 3, 2013 - The ex-wife of former French president Nicolas Sarkozy, Cécilia, claims in a new book that she delivered a blistering verbal attack on Libya's ...

Nicolas Sarkozy's 'shocking comments' lost him election ...

www.telegraph.co.uk > ... > Nicolas Sarkozy ▼ The Daily Telegraph ▼ Oct 3, 2013 - Nicolas Sarkozy displayed a "worrying impulsiveness" and his "shocking ... She also settles a few scores with her ex-husband, notably over the ...

Sarkozy's ex-wife talks of regret, scolding Gaddafi - The Local

www.thelocal.fr/.../cecilia-attias-**sarkozy**-gaddafi-libya-fouquets-royal

Oct 4, 2013 - Sho's been locked in a room with Libyan dictator Colonel Gaddafi, at whom

Nicolas Sarkozy

Former President of France

Nicolas Sarkozy is a French politician who served as the 23rd President of France from 16 May 2007 until 15 May 2012. Before his presidency, he was the leader of the Union for a Popular Movement. Wikipedia

Born: January 28, 1955 (age 59), Paris, France

Height: 5' 5" (1.65 m)

Presidential term: May 16, 2007 – May 15, 2012

Party: Union for a Popular Movement

Spouse: Carla Bruni (m. 2008), Cécilia Attias (m. 1996-2007), Marie-

Dominique Culioli (m. 1982–1996)

Siblings: Olivier Sarkozy, Guillaume Sarkozy, François Sarközy de

Nagy-Bocsa, Caroline Sarközy de Nagy-Bocsa











Sign in

Web

News

Images

Videos

More ▼

Search tools



entity



Nicolas Sarkozy > Ex-spouse

Shopping

relation/attribute

Marie-Dominique Culioli



Cécilia Attias



Cécilia Attias - Wikipedia, the free encyclopedia

en.wikipedia.org/wiki/Cécilia_Attias ▼ Wikipedia ▼

When her **husband** was a minister, Cécilia **Sarkozy** had an office next to his, ... announcement by stating that the **Sarkozys** had actually officially **divorced**. Background - Political life - Personal life - Cécilia Attias Foundation for ...

Cecilia Attias tells how friends tried to snap up **Sarkozy** after ...

www.dailymail.co.uk/.../Cecilia-Attias-tells-friends-tried-snap-... ▼ Daily Mail ▼ Oct 4, 2013 - **Sarkozy's ex-wife** reveals how 'several of her friends' dumped their husbands in desperate rush to become France's next First Lady after her ...

Sarkozy's ex-wife 'berated' Libya's Gaddafi - France 24

www.france24.com/.../20131003-france-cecilia-attias-sarkozy-... ▼ France 24 ▼ Oct 3, 2013 - The ex-wife of former French president Nicolas Sarkozy, Cécilia, claims in a new book that she delivered a blistering verbal attack on Libya's ...

Nicolas Sarkozy's 'shocking comments' lost him election ...

www.telegraph.co.uk > ... > Nicolas Sarkozy ▼ The Daily Telegraph ▼ Oct 3, 2013 - Nicolas Sarkozy displayed a "worrying impulsiveness" and his "shocking ... She also settles a few scores with her ex-husband, notably over the ...

Sarkozy's ex-wife talks of regret, scolding Gaddafi - The Local

www.the local.fr/.../cecilia-attias-sarkozy-gaddafi-libya-fouquets-royal ~

Oct 4, 2013 - Sho's been locked in a room with Libyan dictator Colonel Gaddafi, at whom

Nicolas Sarkozy

Former President of France

Nicolas Sarkozy is a French politician who served as the 23rd President of France from 16 May 2007 until 15 May 2012. Before his presidency, he was the leader of the Union for a Popular Movement. Wikipedia

Born: January 28, 1955 (age 59), Paris, France

Height: 5' 5" (1.65 m)

Presidential term: May 16, 2007 – May 15, 2012

Party: Union for a Popular Movement

Spouse: Carla Bruni (m. 2008), Cécilia Attias (m. 1996-2007), Marie-

Dominique Culioli (m. 1982–1996)

Siblings: Olivier Sarkozy, Guillaume Sarkozy, François Sarközy de

Nagy-Bocsa, Caroline Sarközy de Nagy-Bocsa











Sign in

Web

News

Shopping Images

Videos

More ▼

Search tools



entity



Nicolas Sarkozy > Ex-spouse

relation/attribute

Marie-Dominique Culioli



Cécilia Attias



entity

Cécilia Attias - Wikipedia, the free encyclopedia

en.wikipedia.org/wiki/Cécilia Attias ▼ Wikipedia ▼

When her **husband** was a minister, Cécilia **Sarkozy** had an office next to his, ... announcement by stating that the **Sarkozys** had actually officially **divorced**. Background - Political life - Personal life - Cécilia Attias Foundation for ...

Cecilia Attias tells how friends tried to snap up **Sarkozy** after ...

www.dailymail.co.uk/.../Cecilia-Attias-tells-friends-tried-snap-...
Daily Mail
Oct 4, 2013 - Sarkozy's ex-wife reveals how 'several of her friends' dumped their husbands in desperate rush to become France's next First Lady after her ...

Sarkozy's ex-wife 'berated' Libya's Gaddafi - France 24

www.france24.com/.../20131003-france-cecilia-attias-sarkozy-... ▼ France 24 ▼ Oct 3, 2013 - The ex-wife of former French president Nicolas Sarkozy, Cécilia, claims in a new book that she delivered a blistering verbal attack on Libya's ...

Nicolas Sarkozy's 'shocking comments' lost him election ...

www.telegraph.co.uk > ... > Nicolas Sarkozy ▼ The Daily Telegraph ▼ Oct 3, 2013 - Nicolas **Sarkozy** displayed a "worrying impulsiveness" and his "shocking ... She also settles a few scores with her **ex-husband**, notably over the ...

Sarkozy's ex-wife talks of regret, scolding Gaddafi - The Local

www.thelocal.fr/.../cecilia-attias-**sarkozy**-gaddafi-libya-fouquets-royal

Oct 4, 2013 - Sho's been locked in a room with Libyan dictator Colonel Gaddafi, at whom

Nicolas Sarkozy

Former President of France

Nicolas Sarkozy is a French politician who served as the 23rd President of France from 16 May 2007 until 15 May 2012. Before his presidency, he was the leader of the Union for a Popular Movement. Wikipedia



Height: 5' 5" (1.65 m)

Presidential term: May 16, 2007 – May 15, 2012

Party: Union for a Popular Movement

Spouse: Carla Bruni (m. 2008), Cécilia Attias (m. 1996-2007), Marie-

Dominique Culioli (m. 1982–1996)

Siblings: Olivier Sarkozv, Guillaume Sarkozv, François Sarközv de

Nagy-Bocsa, Caroline Sarközy de Nagy-Bocsa











Sign in

Web

News

Shopping

Images

More ▼

re ▼

Search tools



entity



Nicolas Sarkozy > Ex-spouse

relation/attribute

entity

Marie-Dominique Culioli



Videos

Cécilia Attias



entity

Cécilia Attias - Wikipedia, the free encyclopedia

en.wikipedia.org/wiki/Cécilia Attias ▼ Wikipedia ▼

When her **husband** was a minister, Cécilia **Sarkozy** had an office next to his, ... announcement by stating that the **Sarkozys** had actually officially **divorced**. Background - Political life - Personal life - Cécilia Attias Foundation for ...

Cecilia Attias tells how friends tried to snap up **Sarkozy** after ...

www.dailymail.co.uk/.../Cecilia-Attias-tells-friends-tried-snap-...
Daily Mail
Oct 4, 2013 - Sarkozy's ex-wife reveals how 'several of her friends' dumped their husbands in desperate rush to become France's next First Lady after her ...

Sarkozy's ex-wife 'berated' Libya's Gaddafi - France 24

www.france24.com/.../20131003-france-cecilia-attias-sarkozy-... ▼ France 24 ▼ Oct 3, 2013 - The ex-wife of former French president Nicolas Sarkozy, Cécilia, claims in a new book that she delivered a blistering verbal attack on Libya's ...

Nicolas Sarkozy's 'shocking comments' lost him election ...

www.telegraph.co.uk > ... > Nicolas Sarkozy ▼ The Daily Telegraph ▼ Oct 3, 2013 - Nicolas **Sarkozy** displayed a "worrying impulsiveness" and his "shocking ... She also settles a few scores with her **ex-husband**, notably over the ...

Sarkozy's ex-wife talks of regret, scolding Gaddafi - The Local

www.thelocal.fr/.../cecilia-attias-**sarkozy**-gaddafi-libya-fouquets-royal

Oct 4, 2013 - Sha's been locked in a room with Libyan dictator Colonal Gaddafi, at whom

Nicolas Sarkozy

Former President of France

Nicolas Sarkozy is a French politician who served as the 23rd President of France from 16 May 2007 until 15 May 2012. Before his presidency, he was the leader of the Union for a Popular Movement. Wikipedia



Height: 5' 5" (1.65 m)

Presidential term: May 16, 2007 – May 15, 2012

Party: Union for a Popular Movement

Spouse: Carla Bruni (m. 2008), Cécilia Attias (m. 1996-2007), Marie-

Dominique Culioli (m. 1982–1996)

Siblings: Olivier Sarkozy, Guillaume Sarkozy, François Sarközy de

Nagy-Bocsa, Caroline Sarközy de Nagy-Bocsa









Web

News

Shopping

Images Vio

More -

Search tools

T)

entity



Nicolas Sarkozy > Ex-spouse

relation/attribute

entity

Marie-Dominique Culioli



Cécilia Attias



entity

Cécilia Attias - Wikipedia, the free encyclopedia

en.wikipedia.org/wiki/Cécilia Attias ▼ Wikipedia ▼

When her **husband** was a minister, Cécilia **Sarkozy** had an office next to his, ... announcement by stating that the **Sarkozys** had actually officially **divorced**. Background - Political life - Personal life - Cécilia Attias Foundation for ...

Cecilia Attias tells how friends tried to snap up **Sarkozy** after ...

www.dailymail.co.uk/.../Cecilia-Attias-tells-friends-tried-snap-... ▼ Daily Mail ▼ Oct 4, 2013 - **Sarkozy's ex-wife** reveals how 'several of her friends' dumped their husbands in desperate rush to become France's next First Lady after her ...

Sarkozy's ex-wife 'berated' Libya's Gaddafi - France 24

www.france24.com/.../20131003-france-cecilia-attias-sarkozy-... ▼ France 24 ▼ Oct 3, 2013 - The ex-wife of former French president Nicolas Sarkozy, Cécilia, claims in a new book that she delivered a blistering verbal attack on Libya's ...

Nicolas Sarkozy's 'shocking comments' lost him election ...

www.telegraph.co.uk > ... > Nicolas Sarkozy ▼ The Daily Telegraph ▼ Oct 3, 2013 - Nicolas Sarkozy displayed a "worrying impulsiveness" and his "shocking ... She also settles a few scores with her ex-husband, notably over the ...

Sarkozy's ex-wife talks of regret, scolding Gaddafi - The Local

www.thelocal.fr/.../cecilia-attias-**sarkozy**-gaddafi-libya-fouquets-royal

Oct 4, 2013 - Sho's been locked in a room with Libyan dictator Colonel Gaddafi, at whom

Nicolas Sarkozy

Former President of France

Nicolas Sarkozy is a French politician who served as the 23rd President of France from 16 May 2007 until 15 May 2012. Before his presidency, he was the leader of the Union for a Popular Movement. Wikipedia



Height: 5' 5" (1.65 m)

Presidential term: May 16, 2007 – May 15, 2012

Party: Union for a Popular Movement

Spouse: Carla Bruni (m. 2008), Cécilia Attias (m. 1996-2007), Marie-

Dominique Culioli (m. 1982–1996)

Siblings: Olivier Sarkozy, Guillaume Sarkozy, François Sarközy de

Nagy-Bocsa, Caroline Sarközy de Nagy-Bocsa







Sign in

Web

News

Shopping Images

Videos

More ¬

Search tools



entity



Nicolas Sarkozy > Ex-spouse

relation/attribute

entity

Marie-Dominique Culioli



Cécilia Attias



entity

Cécilia Attias - Wikipedia, the free encyclopedia

en.wikipedia.org/wiki/Cécilia Attias ▼ Wikipedia ▼

When her **husband** was a minister, Cécilia **Sarkozy** had an office next to his, ... announcement by stating that the **Sarkozys** had actually officially **divorced**. Background - Political life - Personal life - Cécilia Attias Foundation for ...

Cecilia Attias tells how friends tried to snap up **Sarkozy** after ...

www.dailymail.co.uk/.../Cecilia-Attias-tells-friends-tried-snap-... ▼ Daily Mail ▼ Oct 4, 2013 - **Sarkozy's ex-wife** reveals how 'several of her friends' dumped their husbands in desperate rush to become France's next First Lady after her ...

Sarkozy's ex-wife 'berated' Libya's Gaddafi - France 24

www.france24.com/.../20131003-france-cecilia-attias-sarkozy-... ▼ France 24 ▼ Oct 3, 2013 - The ex-wife of former French president Nicolas Sarkozy, Cécilia, claims in a new book that she delivered a blistering verbal attack on Libya's ...

Nicolas Sarkozy's 'shocking comments' lost him election ...

www.telegraph.co.uk > ... > Nicolas Sarkozy ▼ The Daily Telegraph ▼ Oct 3, 2013 - Nicolas Sarkozy displayed a "worrying impulsiveness" and his "shocking ... She also settles a few scores with her ex-husband, notably over the ...

Sarkozy's ex-wife talks of regret, scolding Gaddafi - The Local

www.thelocal.fr/.../cecilia-attias-sarkozy-gaddafi-libya-fouquets-royal

Oct 4, 2013 - Sho's been locked in a room with Libyan dictator Colonel Gaddafi, at whom

Nicolas Sarkozy

Former President of France

Nicolas Sarkozy is a French politician who served as the 23rd President of France from 16 May 2007 until 15 May 2012. Before his presidency, he was the leader of the Union for a Popular Movement. Wikipedia



Height: 5' 5" (1.65 m)

Presidential term: May 16, 2007 – May 15, 2012

Party: Union for a Popular Movement

Spouse: Carla Bruni (m. 2008), Cécilia Attias (m. 1996-2007), Marie-

Dominique Culioli (m. 1982–1996)

Siblings: Olivier Sarkozy, Guillaume Sarkozy, François Sarközy de

Nagy-Bocsa, Caroline Sarközy de Nagy-Bocsa









Web

News

Shopping

Vi

More

Search tools



entity



Nicolas Sarkozy > Ex-spouse

relation/attribute

entity

Marie-Dominique Culioli



Cécilia Attias



entity

Cécilia Attias - Wikipedia, the free encyclopedia

en.wikipedia.org/wiki/Cécilia Attias ▼ Wikipedia ▼

When her **husband** was a minister, Cécilia **Sarkozy** had an office next to his, ... announcement by stating that the **Sarkozys** had actually officially **divorced**. Background - Political life - Personal life - Cécilia Attias Foundation for ...

Cecilia Attias tells how friends tried to snap up **Sarkozy** after ...

www.dailymail.co.uk/.../Cecilia-Attias-tells-friends-tried-snap-... ▼ Daily Mail ▼ Oct 4, 2013 - Sarkozy's ex-wife reveals how 'several of her friends' dumped their husbands in desperate rush to become France's next First Lady after her ...

Sarkozy's ex-wife 'berated' Libya's Gaddafi - France 24

www.france24.com/.../20131003-france-cecilia-attias-sarkozy-... ▼ France 24 ▼ Oct 3, 2013 - The ex-wife of former French president Nicolas Sarkozy, Cécilia, claims in a new book that she delivered a blistering verbal attack on Libya's ...

Nicolas Sarkozy's 'shocking comments' lost him election ...

www.telegraph.co.uk > ... → Nicolas Sarkozy ▼ The Daily Telegraph ▼ Oct 3, 2013 - Nicolas **Sarkozy** displayed a "worrying impulsiveness" and his "shocking ... She also settles a few scores with her **ex-husband**, notably over the ...

Sarkozy's ex-wife talks of regret, scolding Gaddafi - The Local

www.thelocal.fr/.../cecilia-attias-**sarkozy**-gaddafi-libya-fouquets-royal

Oct 4, 2013 - Sho's been locked in a room with Libyan dictator Colonel Gaddafi, at whom

Nicolas Sarkozy

Former President of France

Nicolas Sarkozy is a French politician who served as the 23rd President of France from 16 May 2007 until 15 May 2012. Before his presidency, he was the leader of the Union for a Popular Movement. Wikipedia

Born: January 28, 1955 (age 59), Paris, France

Height: 5' 5" (1.65 m)

Presidential term: May 16, 2007 – May 15, 2012

Party: Union for a Popular Movement

Spouse: Carla Bruni (m. 2008), Cécilia Attias (m. 1996-2007), Marie-

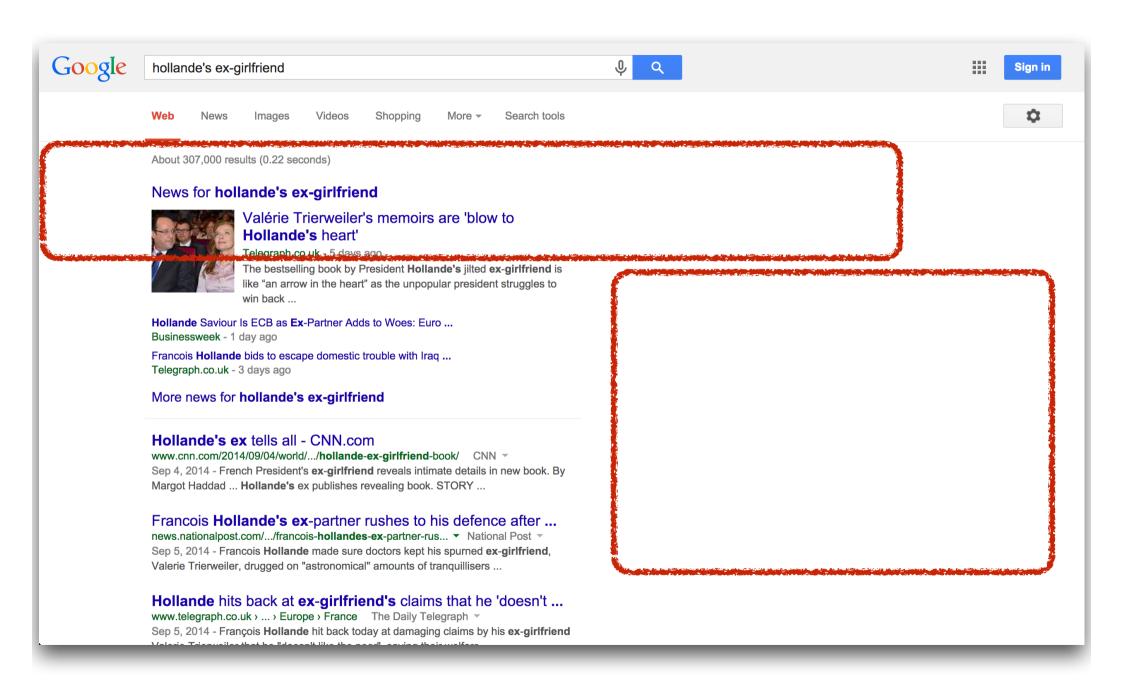
Dominique Culioli (m. 1982–1996)

Siblings: Olivier Sarkozy, Guillaume Sarkozy, François Sarközy de

Nagy-Bocsa, Caroline Sarközy de Nagy-Bocsa









gazprom's banking arm



Q

Web Shopping News Images Videos More ▼ Search tools

About 195,000 results (0.50 seconds)

EU sanctions target Rosneft and Gazprom's oil business ...

www.montrealgazette.com/business/imposes.../story.html The Gazette ▼
Sep 12, 2014 - BRUSSELS - New European Union sanctions against Russia announced
Friday toughen financial penalties on the country's **banks**, **arms** ...

EU sanctions target Rosneft and Gazprom's oil business ...

www.winnipegfreepress.com → Business ▼ Winnipeg Free Press ▼ Sep 12, 2014 - EU sanctions target Rosneft and **Gazprom's** oil business, **banks**, **arms** firms and lawmakers. By: Juergen Baetz, The Associated Press.

European Union Demand Lifts Gazprom Earnings - The ...

www.nytimes.com/.../european-union-demand-lifts-g... The New York Times ▼
Apr 29, 2014 - Gazprom's banking arm, Gazprombank, is owned by the company's ...
For comparison, the price-to-earnings ratio of Gazprom's domestic ...

Focus on Politics and Economics of Russia and Eastern Europe

books.google.com/books?isbn=1600213170

Ulric R. Nichol - 2007 - Business & Economics

Hence, Gazprom all of a sudden finds itself with investment requirements ... Then, Dresdner Kleinwort Wasserstein supplied **Gazprom's banking arm** with ...

This talk is about extracting facts centered around noun phrases (=attributes)

coach

president

province

banking arm

caucus chairman

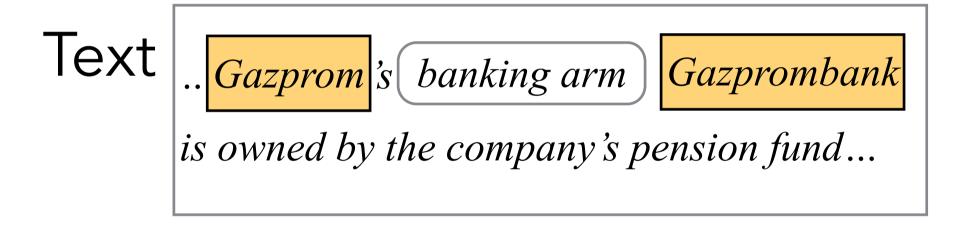
foreign policy chief

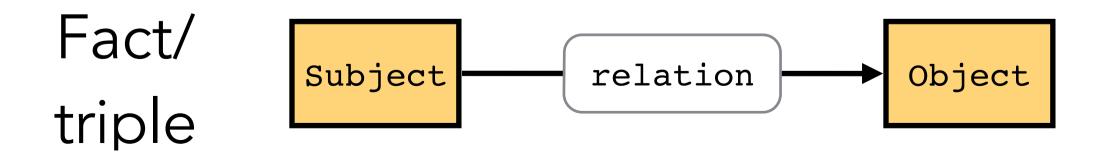
state assemblyman

(Open) Information Extraction

... Gazprom's banking arm Gazprombank is owned by the company's pension fund...

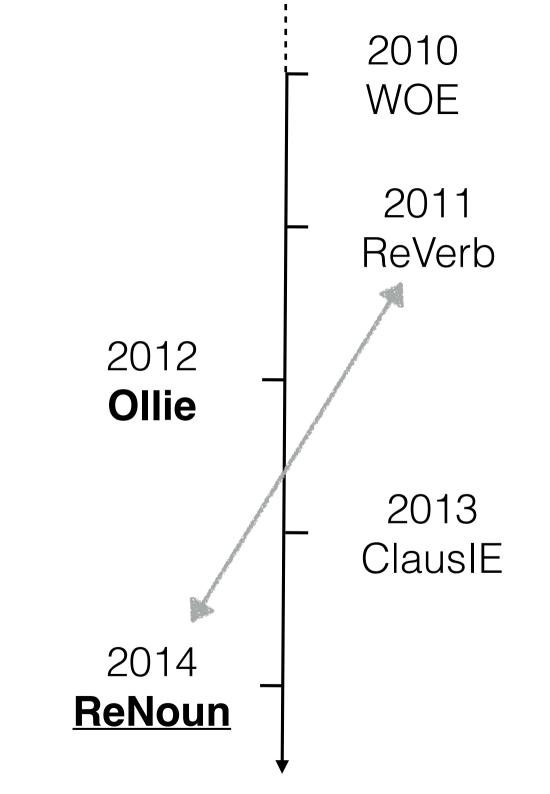
(Open) Information Extraction

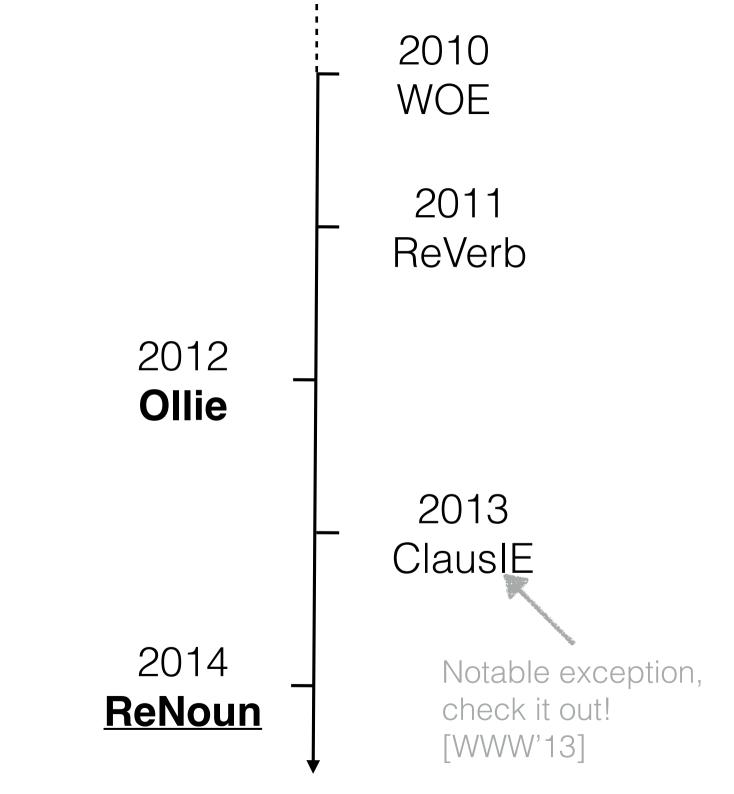


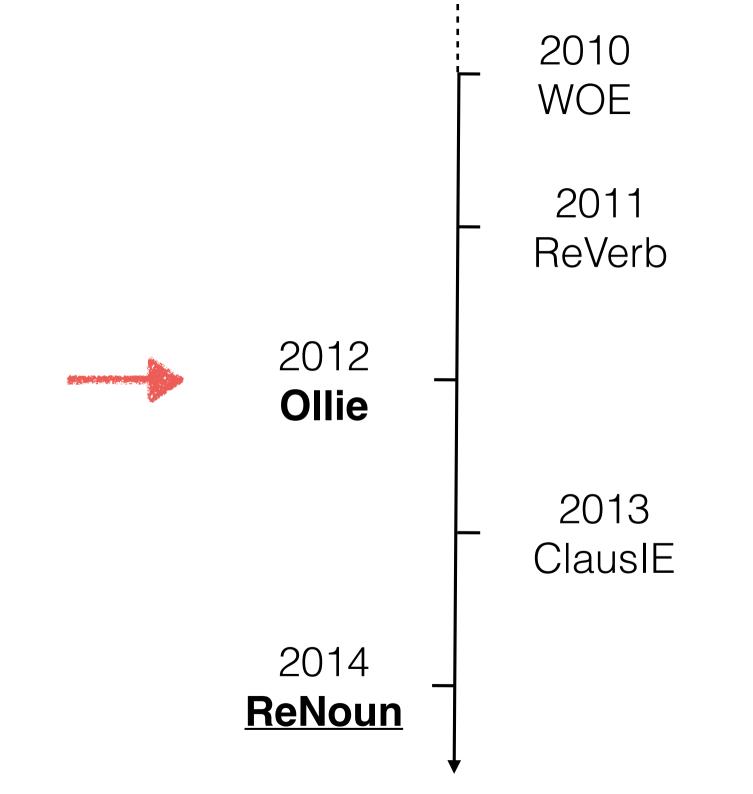


Before the details:

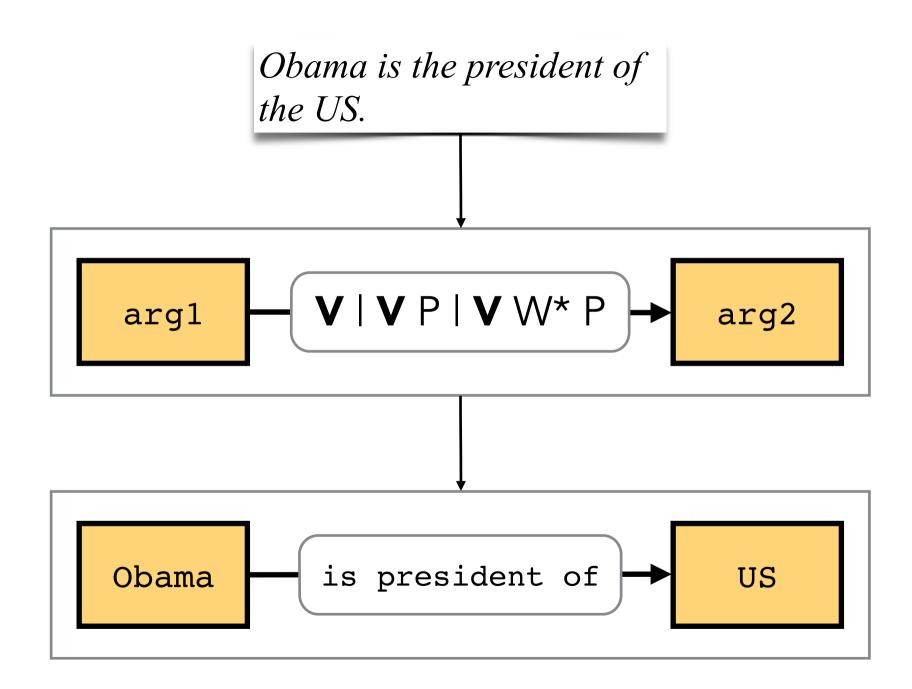
What's missing from the state of the art?

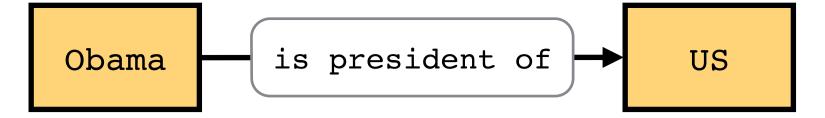






Let's see Ollie...







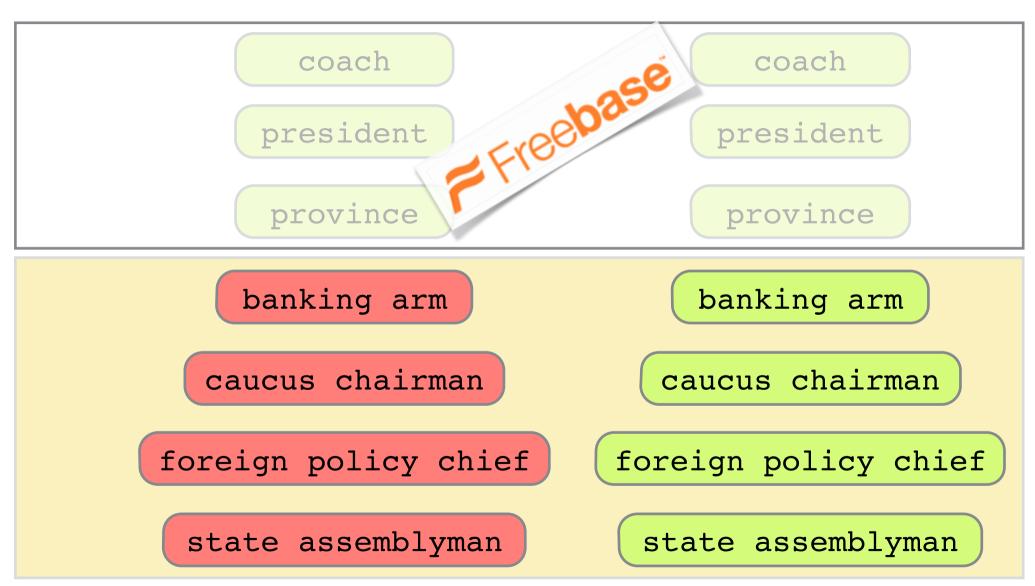
Ollie* ReNoun VS. [EMNLP'12] [this talk] coach coach president president province province banking arm banking arm caucus chairman caucus chairman foreign policy chief foreign policy chief state assemblyman state assemblyman

^{*} Ollie handles verbs, ReNoun doesn't!

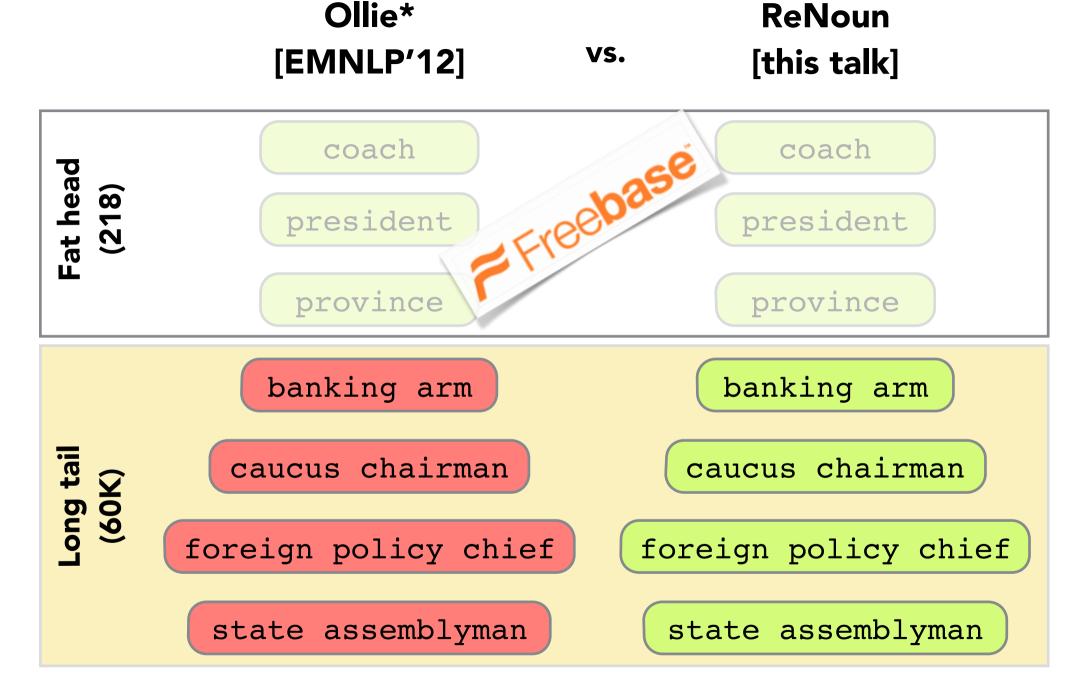
Ollie* ReNoun VS. [EMNLP'12] [this talk] coach coach president president province province banking arm banking arm caucus chairman caucus chairman foreign policy chief foreign policy chief state assemblyman state assemblyman

^{*} Ollie handles verbs, ReNoun doesn't!

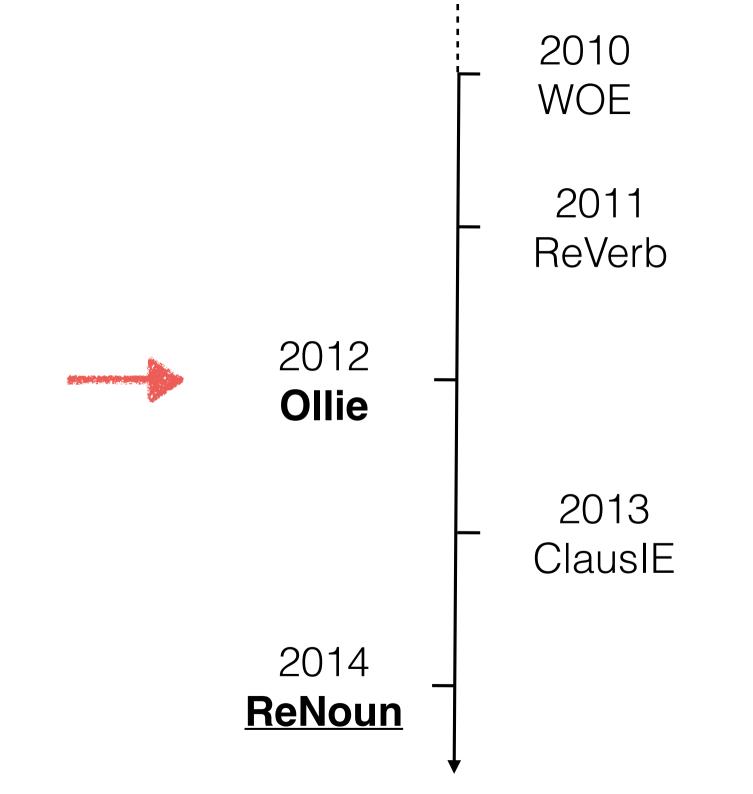
Ollie* ReNoun [EMNLP'12] Vs. [this talk]

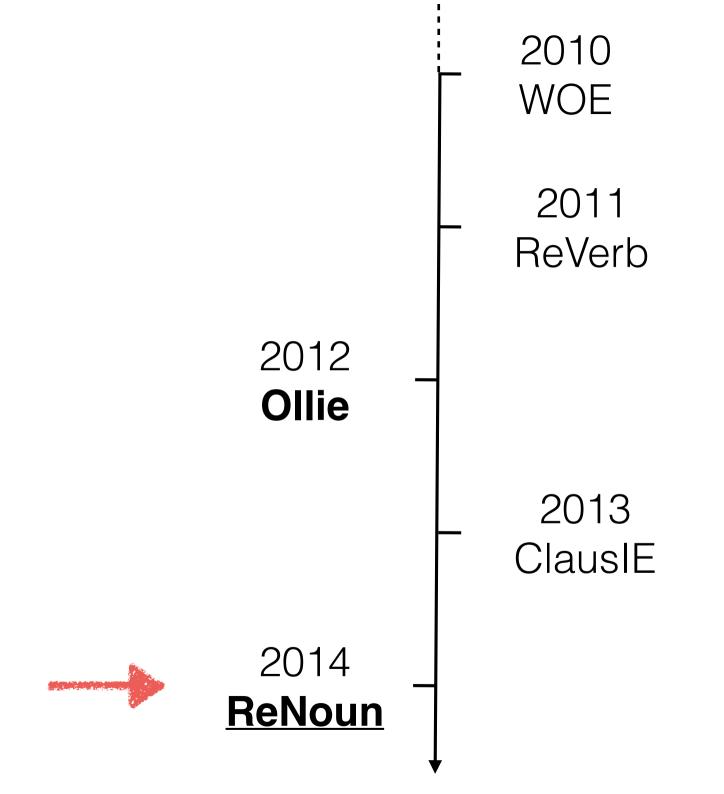


* Ollie handles verbs, ReNoun doesn't!

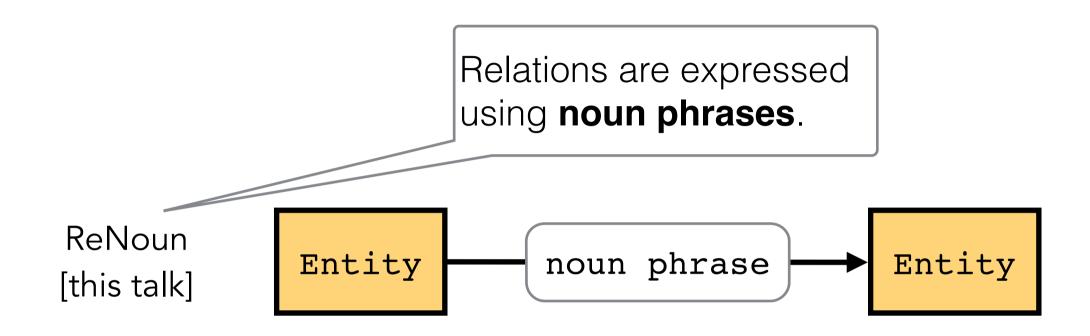


* Ollie handles verbs, ReNoun doesn't!

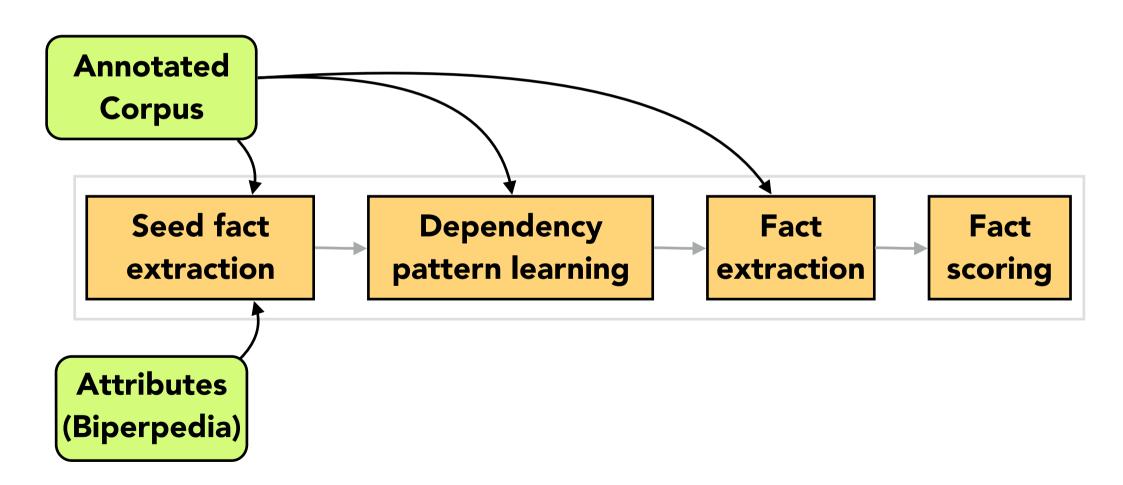




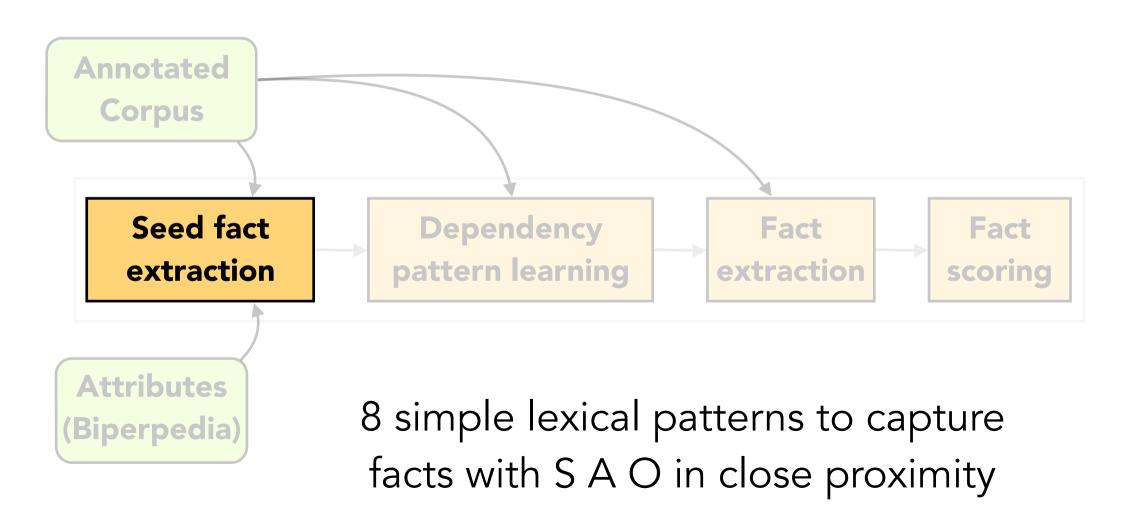
... now, ReNoun is upon us!



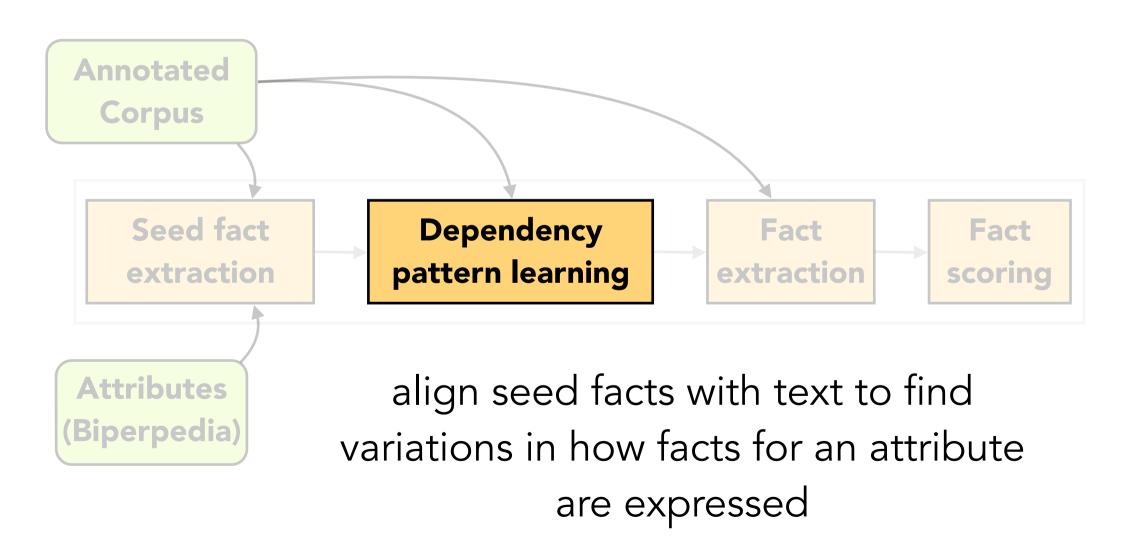
ReNoun



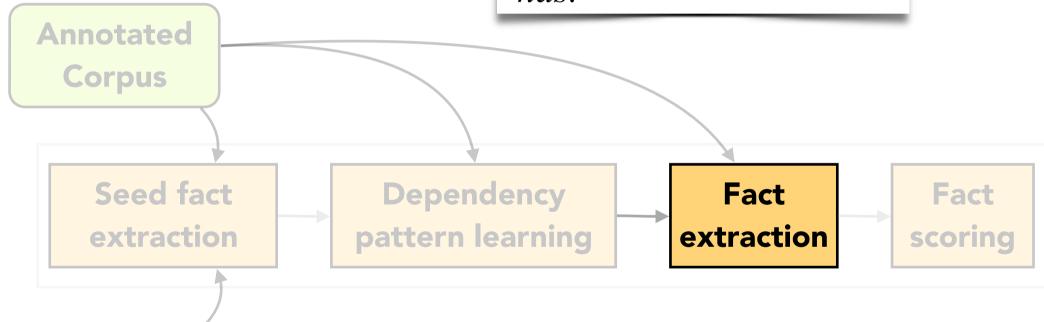
Google CEO Larry Page started his term in 2011.



A CEO, like Larry Page of Google, is usually a busy person.

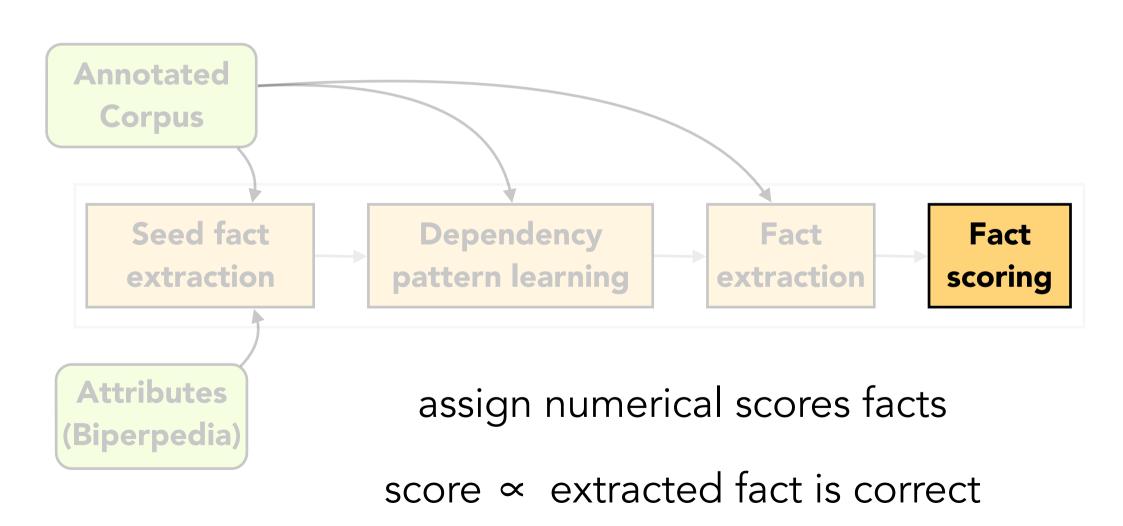


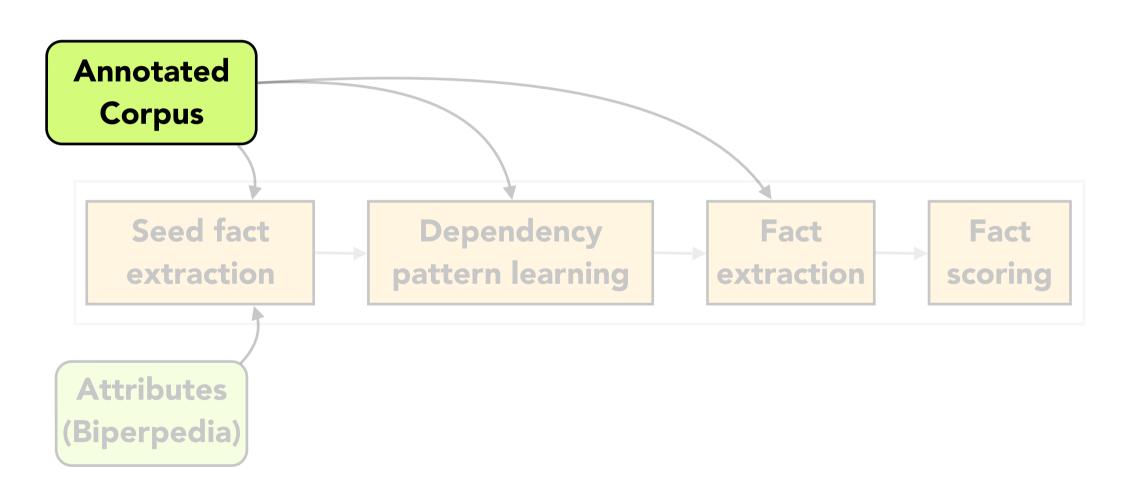
A CEO, like Manouchehr Moshayedi of STEC Inc., is not allowed to trade his company's stocks based on information only he has.



Attributes (Biperpedia)

deploy the dependency patterns to collect more facts

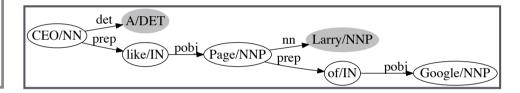




Annotated Corpus

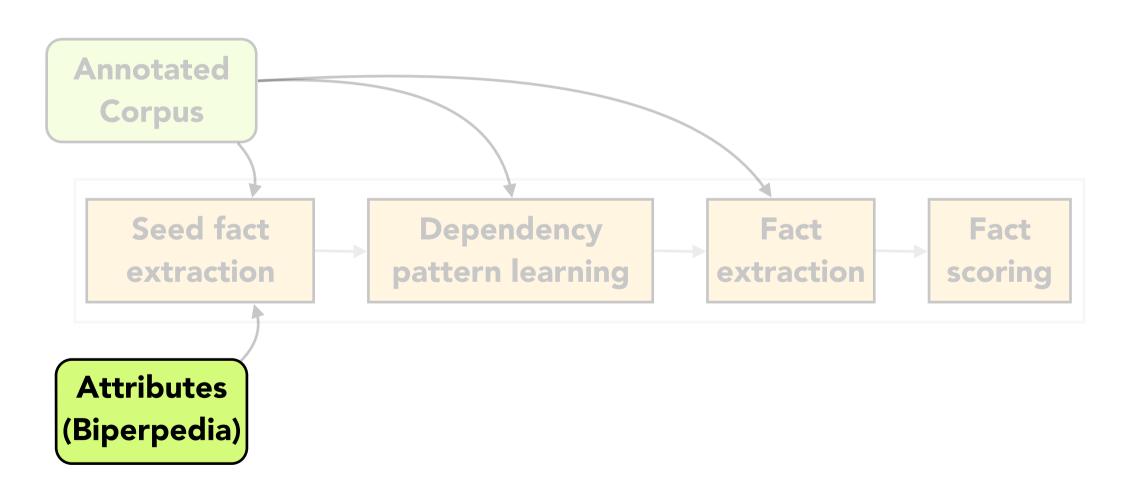
- 1. Dependency parses,
- 2. Noun phrase chunks,
- 3. NER,
- 4. Coreference resolution,
- 5. Entity resolution to Freebase

400x10⁶ news documents

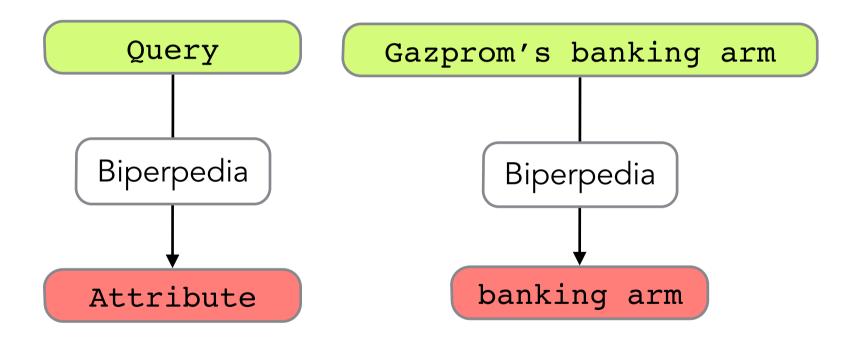


[Google]₁ [CEO]₂ [Larry Page]₂ started his term in 2011, when [he]₂ succeeded [Eric Schmidt]₃.

Cluster	Phrase	Freebase ID
1	Google	/m/045c7b
2	Larry Page, CEO, he	/m/0gjpq
3	Eric Schmidt	/m/0gjpq

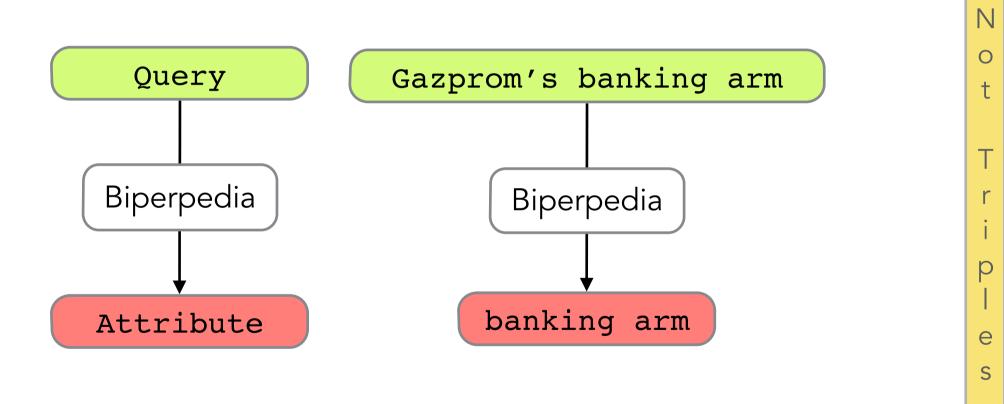


Attributes: Biperpedia [Gupta et al., VLDB'14]

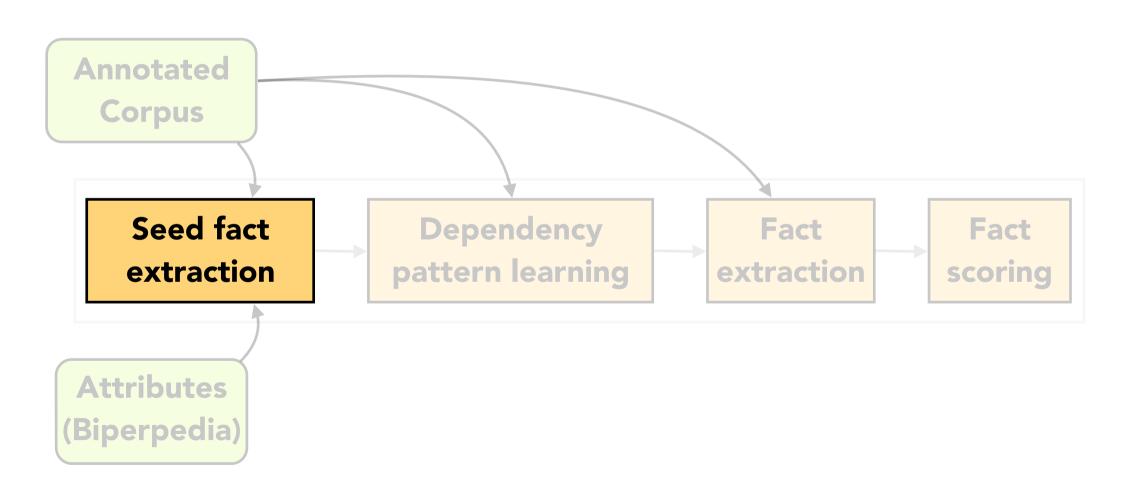


for more details, see the VLDB'14 paper, also [Lee at al., ICDE'13] and [Pasca & van Durma, IJCAI'07]

Attributes: Biperpedia [Gupta et al., VLDB'14]



for more details, see the VLDB'14 paper, also [Lee at al., ICDE'13] and [Pasca & van Durma, IJCAI'07]



[Google]₁ [CEO]₂ [Larry Page]₂ started his term in 2011, when [he]₂ succeeded [Eric Schmidt]₃.

#1: A in Biperpedia & one of <u>8 pattern</u> applies

#	Pattern	Example
1	the A of S, O	the CEO of Google, Larry Page
2	the A of S is O	the CEO of Google is Larry Page
3	O, S A	Larry Page, Google CEO
4	0, S's A	Larry Page, Google's CEO
5	O, [the] A of S	Larry Page, [the] CEO of Google
6	SAO	Google CEO Larry Page
7	SA, O	Google CEO, Larry Page
8	S's A, O	Google's CEO, Larry Page

[Google]₁ [CEO]₂ [Larry Page]₂ started his term in 2011, when [he]₂ succeeded [Eric Schmidt]₃.

#1: A in Biperpedia & one of 8 pattern applies

#	Pattern	Example
1	the A of S, O	the CEO of Google, Larry Page
2	the A of S is O	the CEO of Google is Larry Page
3	O, S A	Larry Page, Google CEO
4	O, S's A	Larry Page, Google's CEO
5	O, [the] A of S	Larry Page, [the] CEO of Google
6	SAO	Google CEO Larry Page
7	SA, O	Google CEO, Larry Page
8	S's A, O	Google's CEO, Larry Page

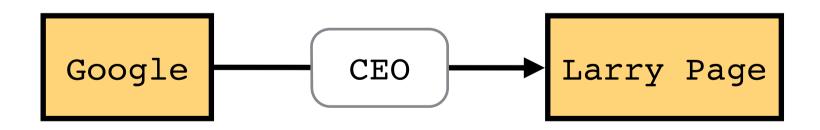
#2: A and O Corefer

[Google]₁ [CEO]₂ [Larry Page]₂ started his term in 2011, when [he]₂ succeeded [Eric Schmidt]₃.

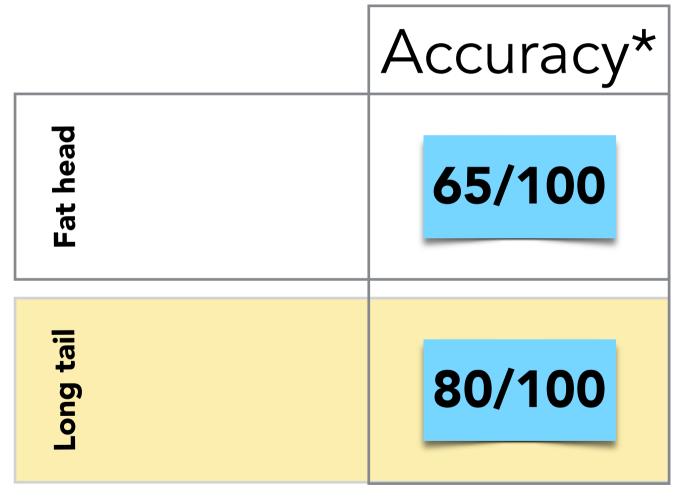
Cluster	Phrase	Freebase ID
1	Google	/m/045c7b
2	Larry Page, CEO, he	/m/0gjpq
3	Eric Schmidt	/m/0gjpq

Result

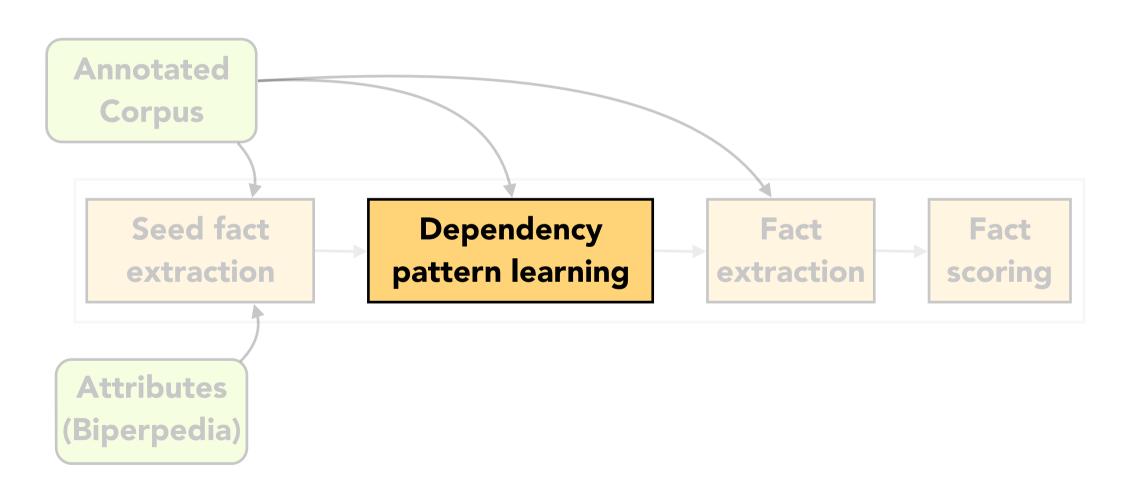
[Google]₁ [CEO]₂ [Larry Page]₂ started his term in 2011, when [he]₂ succeeded [Eric Schmidt]₃.

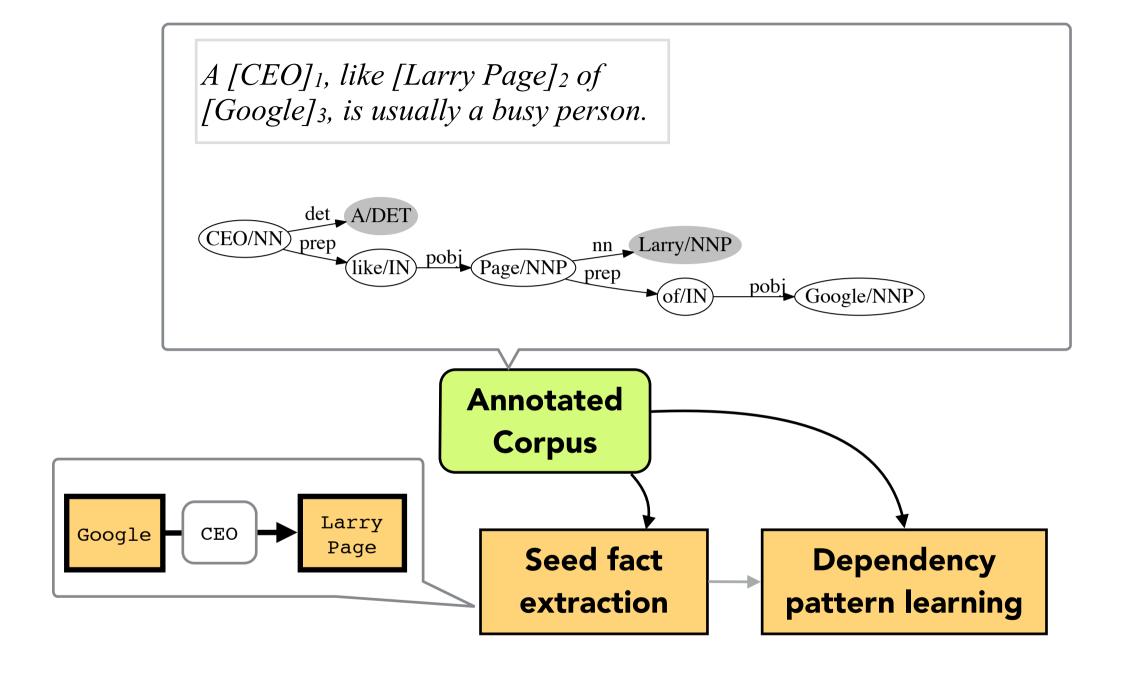


139M Seed facts, 680K unique

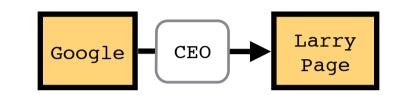


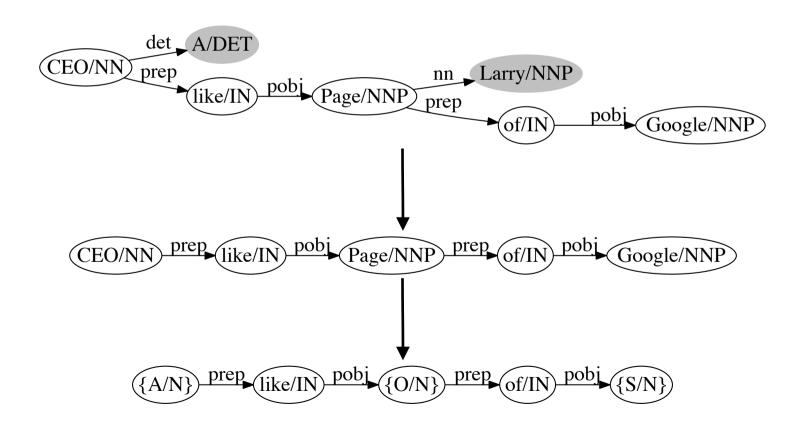
^{*}random sample of 100 seed facts

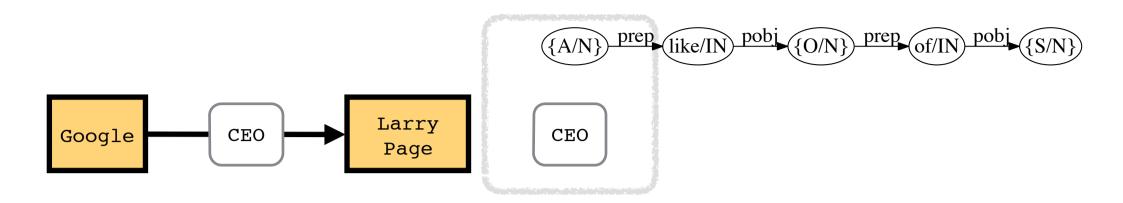


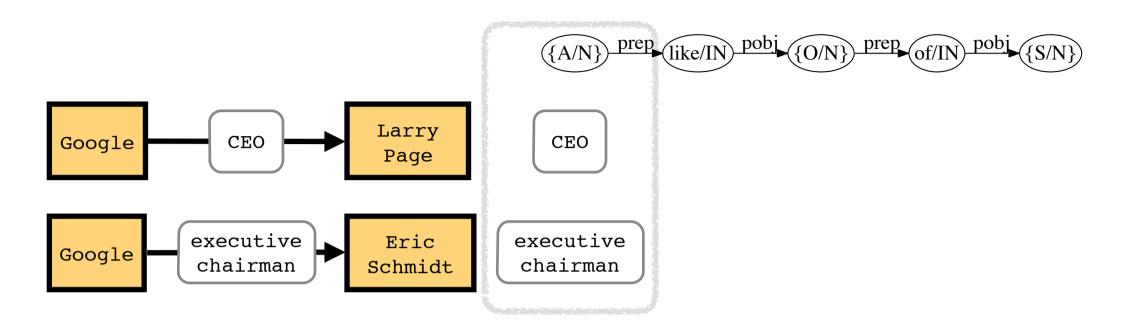


Dependency pattern learning

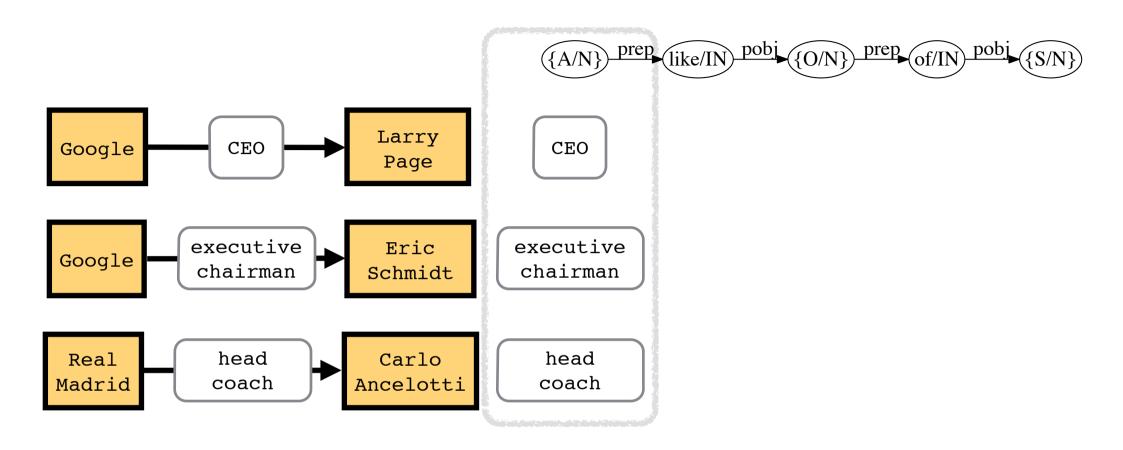




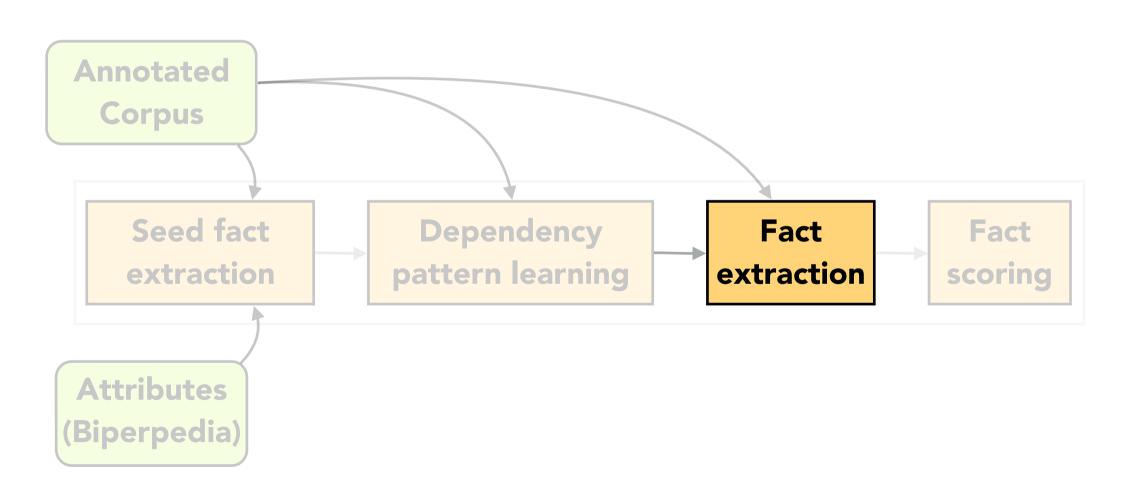




Same pattern could apply to multiple attributes...



Same pattern could apply to multiple attributes...
...useful for scoring



Fact extraction

A CEO, like Manouchehr Moshayedi of STEC Inc., is not allowed to trade his company's stocks based on information only he has. prep (like/IN) pobj ({O/N}) prep (of/IN) executive head (A/N)CEO chairman coach Manouchehr CEO STEC Inc. Moshayedi

Argument order

