



### Computational Lexicology & Terminology Lab



Agata Cybulska





















Tommaso Caselli







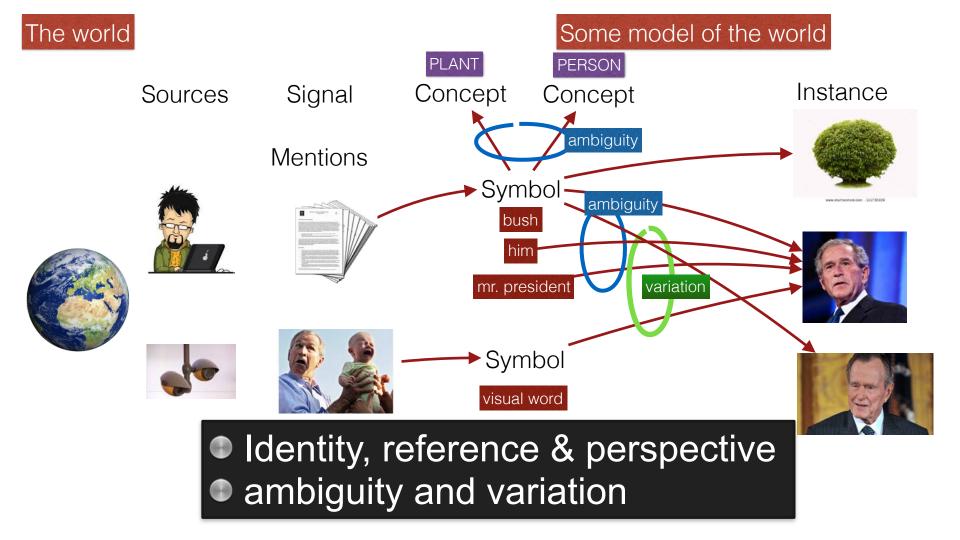




Antske Fokkens

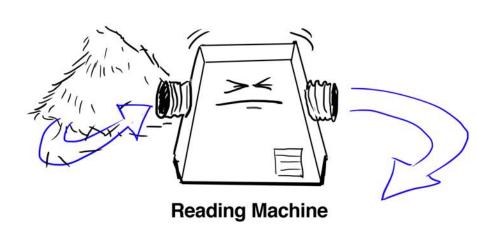
Selene Kolman

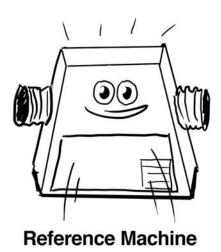
Roxane Segers Hennie van der Vliet



### **Grounding language for machines:**

from Reading Machines to Reference Machines











## Computational Lexicology & Terminology Lab

We build reading machines

- reading millions of news articles
- detecting events
- creating billions of statements





### From text to the world

### News texts

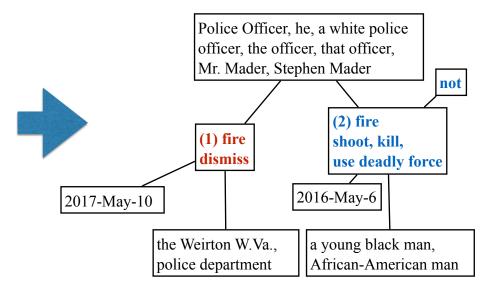
The New York Times

Police Officer Says He Was Fired (1) for Not Shooting (2). .. The officer could have fired (2) a shot, but he didn't. That officer, Stephen Mader, now 26, was dismissed (1) weeks later by the Weirton, W.Va., police department.

Newsweek

The Weirton Police Department terminated (1) Mr. Mader's employment because he chose not to use deadly force to shoot (2) and kill (2) and African-American man, who was suicidal, and whom Mr. Mader reasonably believed did not pose a risk of death or serious bodily injury,

Event-Centric
Knowledge Graph



Boxes are instances

### From text to the world

#### News texts



Police Officer Says He Was Fired (1) for Not Shooting (2). .. The officer could have fired (2) a shot, but he didn't. That officer, Stephen Mader, now 26, was dismissed (1) weeks later by the Weirton, W.Va., police department.







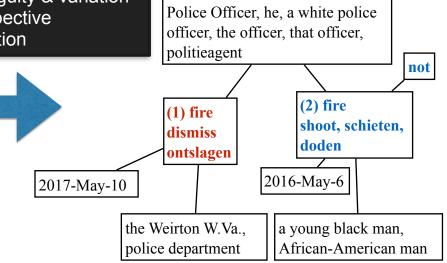


Een voormalige Weirton, W.Va., politieagent heeft woensdag een rechtszaak tegen de stad ingediend. Hij beweerde dat hij werd ontslagen omdat hij collega's in gevaar had gebracht nadat hij ervoor gekozen had geen man te schieten en te doden die tijdens een huiselijk geschil een wapen had gezet.

#### What defines an event?

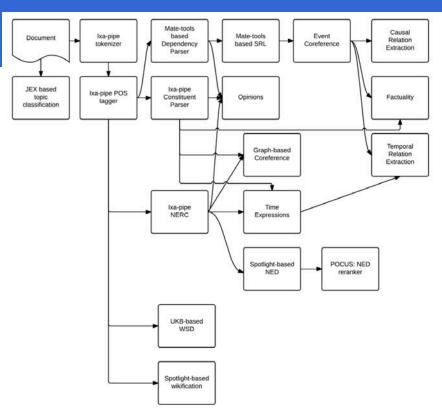
- identity
- granularity
- ambiguity & variation
- perspective
- intention

Event-Centric Knowledge Graph

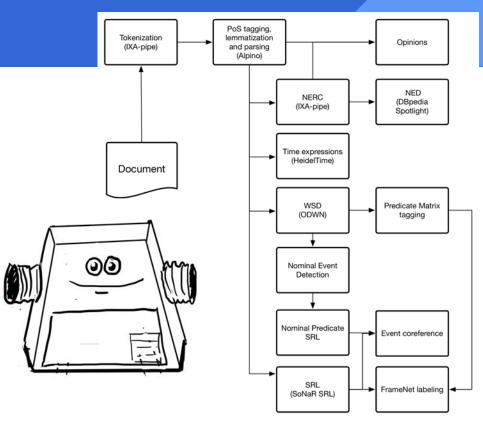


Boxes are instances

### NewsReader English pipeline



### Dutch pipeline



2008

2009

2010

2011

2012

2013

2014

2003

2004

2005

2006

### There is no such thing as a simple text

#### Brian Shilhavy Health Impact News Editor

With the measles and measles vaccine debate reaching a near frenzy on the Internet, it is always nice to throw some cold hard facts on the firestorm currently raging in the measles debate.

So here are some easily verifiable facts regarding deaths due to measles in the United States for the past 10 years, and deaths due to measles vaccines during the same 10 year period.

First, the Centers for Disease Control and Prevention (CDC) keeps a weekly tally of disease outbreaks, including deaths. According to a statement made by Dr. Anne Schuchat, the director of CDC's National Center for Immunization and Respiratory Diseases, in an Associated Press story picked up by Fox News on April 25, 2014:

There hs been no measles deaths reported in the U.S. since 2003. [1]

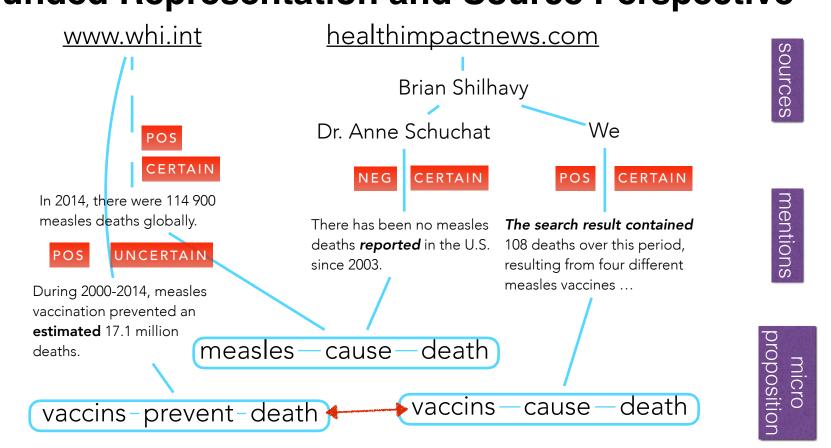
STATEMENT

TIME

SOURCE

AUTHORITY

### GRaSP Grounded Representation and Source Perspective

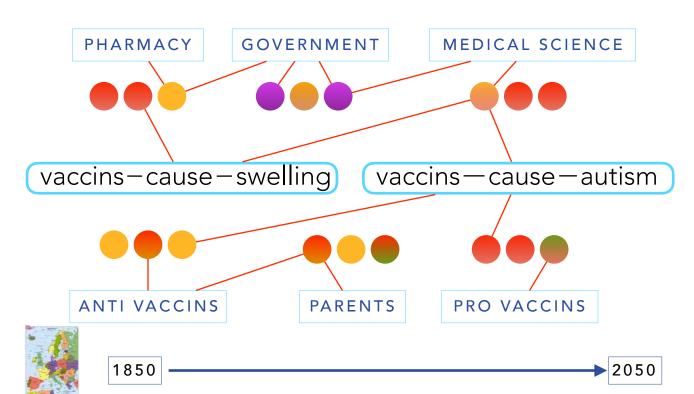


### GR*a*SP

### **Grounded Representation and Source Perspective**

= certain, denial, sells pills, angry

Perspectives in texts

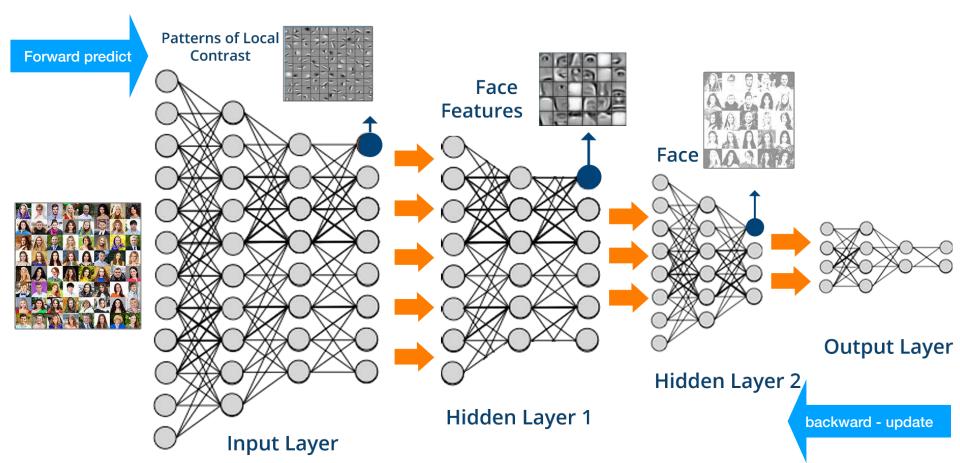


## Robots: a threat? Reference and perspective in the physical world





### In search of the perfect machine: Deep Learning

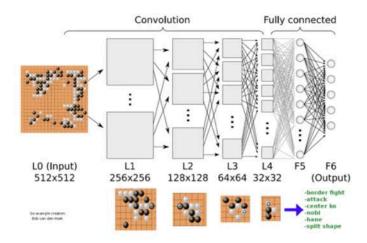




A team of California-based Google researchers developed GoogLeNet, that uses an advanced classification and detection algorithm to identify object. The technology is so accurate, it can distinguish a range of object sizes, and it can also determine an object within or on an object ¿ such as a dog wearing a hat (pictured)

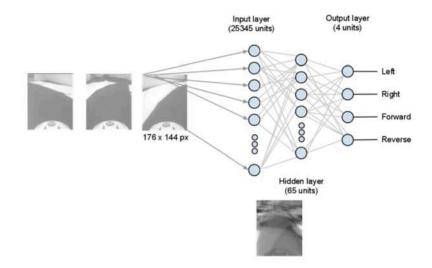
### Playing Go





### Self Driving Car





### Data bias: the chemist



a) Input image



entity object substance object location living artifact land region living ( organism organism <sub>4</sub> instrument island district person plant device animal person administrative ovascular chordate scientist cre ator vertebrate writer skilled chemist 3 tree

b) Neighbors c) Ground truth d) Wordnet voted branches

## Sexism & stereotypes in image descriptions emiel.van.miltenburg@vu.nl



Human descriptions by "the crowd"

A worker is being scolded by her boss in a stern lecture.

A manager talks to an employee about job performance.

A hot, blond girl getting criticized by her boss.

### From language to visual world

In a chair, at the far side of the room facing the outer door, sat a woman. Her long yellow hair rippled down her shoulders; her gown was green, green as young reeds, shot with silver like beads of dew; and her belt was of gold, shaped like a chain of flag-lilies set with the pale-blue eyes of forget-me-nots. About her feel in wide vessels of green and brown earthenware, white water-lilies were floating, so that she seemed to be enthroned in the midst of a pool.















- \*Language has underspecified meanings
- \*We pour from our personal experiences to fill in the details
- \*As much is not told as there is told

### From visual world to language



naarling, beroerling, ellendeling, etterbak, etterbuil, fielt, fluim, gemenerik, j hond, hondenlul, kankerlijer, kelerelijder, kelerelijer, klerelijer, kloot, kloothommel, klootspiraal, klootzak, kwal, lamgat, lammeling, lamstraal, words for a lamzak, lazersteen, lazerstraal, loeder, lul, lulhannes, lulletje, miesgasser, mispunt, onverlaat, paardelul, paardenlul, patjakker, pleurislijder, ploert, plurk, pokkenlijer, pokkenvent, pooier, rasploert, reptiel, rotzak, schoelje, schoft, serpent, smeerlap, stinker, teringlijder, tyfuslijer, vuilak, zakkenwasser, zwijn, zak, hondelul, etter, lelijkerd, smiecht, pokkenlijder, sekreet, stinkerd, individu

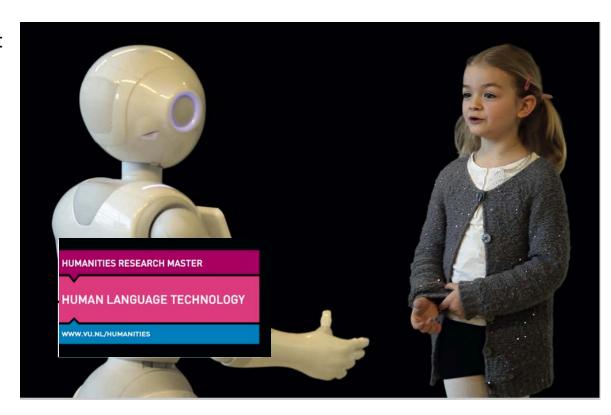
- huichelaar, Januskop, draaikont, farizeeër, hypocriet, januskop, jezuïet, smoelentrekker, valsaard, valserik, veinzaard, veinzer
- onruststoker, aanstoker, aanzetter, agitator, herrieschopper, onrustzaaier, oproerkraaier, opruier, paniekzaaier, provocateur, raddraaier, roervink, stemmingmaker, stokebrand, stoker, woelgeest
- boef, booswicht, galgenbrok, galgenaas, gannef, kwaaddoener, satan, slechterik, snoodaard, spitsboef, zwijnjak, schurk
- krankzinnige, fanatiekeling, geesteszieke, gek, gestoorde, waanzinnige, fanate
- dwaas, achterlijke, gek, halvezool, idioot, imbeciel kwibus, lijp, lijpo, mafkees, mafketel, mafkikker, malloot, nar piechem, zot, druif, debiel

8.643 dutch person

Which on to pick for a bad person?

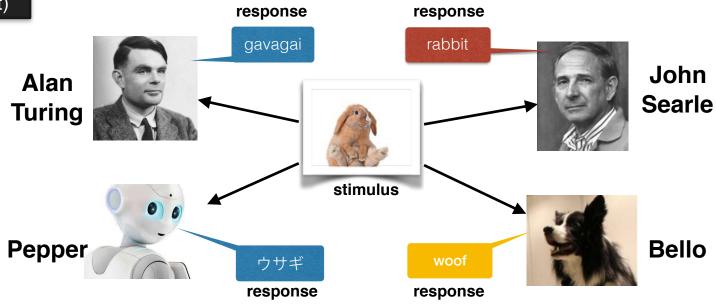
### Communicative machines

- Systems will never be perfect
- Uncertainty and perspective needs to be built in from the start
- System should communicate with people to establish interpretation
- System should communicate with people about their impact on us

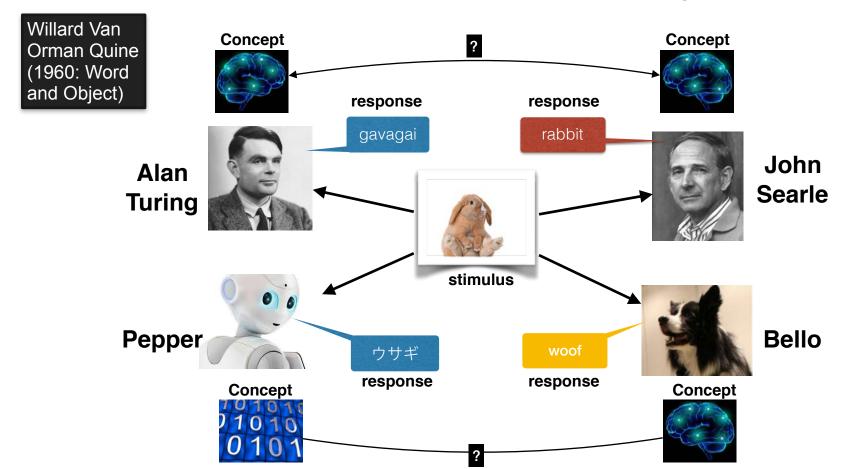


## The association trap

Willard Van Orman Quine (1960: Word and Object)



## The association trap



# These robots do NOT (yet) talk!

Nao Ik ben Alice

### The reference machine



Selene Baez



Lenka Bajcetic



Bram Kraaijeveld

I spy with my little eye something and it is.....



