



### Sentiment, Stance, and Communicative Power

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# **Semantic Network**

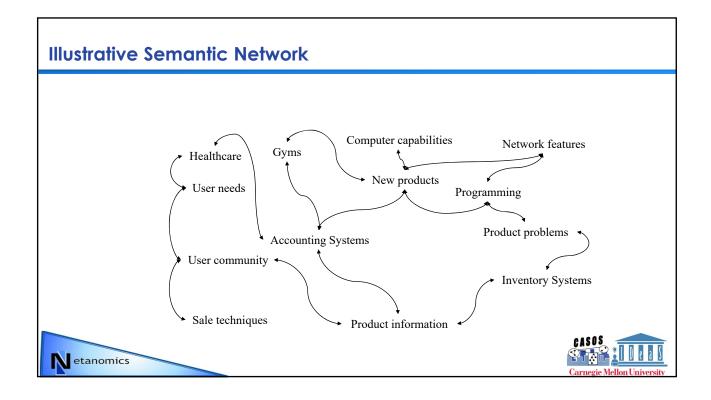
- Network of concepts
- Sometimes referred to as
  - a mental model
  - An information network
- Generally extracted from texts
- Variations on nodes
  - Words –vs- concepts
  - topics -vs- concepts
- Features of links
  - Co-use or logic or semantic relations
  - Strength generally represents frequency
    - In text or across texts











# Why compare texts as networks: Locating Common Ground

- Do people use same words
- Do people use same words in same way
- Do people evoke the same concepts
- Do people link the same concepts in the same way
- · Are the same disciplines employed
- Are the same journals, trade magazines, etc. read



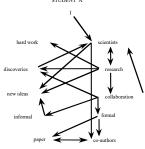




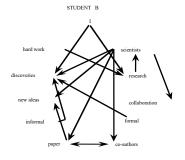


## **Information Network: Text & Graphics**

Student A: I found that scientists engage in research in order to make discoveries and generate new ideas. Such research by scientists is hard work and often involves collaboration with other scientists which leads to discoveries which make the scientists famous. Such collaboration may be informal, such as when they share new ideas over lunch, or formal, such as when they are coauthors of a paper.



Student B: It was hard work to research famous scientists engaged in collaboration and I made many informal discoveries. My research showed that scientists engaged in collaboration with other scientists are co-authors of at least one paper containing their new ideas. Some scientists make formal discoveries and have new ideas.

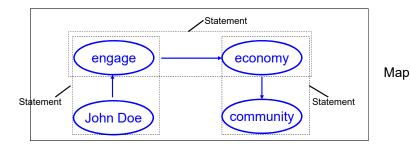




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# **Window Based Location of Links**

• John\_Doe is actively engage in several economy and community.





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# Extraction of Relational Data From Texts — Toy Example

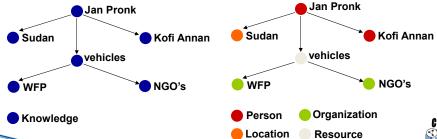
Example from UN News Service (New York), 12-28-2004:

"Jan Pronk, the Special Representative of Secretary-General Kofi Annan to Sudan, today called for the immediate return of the vehicles to World Food Programme (WFP) and NGOs."

### extract relational data

One-mode networks semantic networks

multi-mode networks meta-networks







# **Default Ontology**

- Named Entities
  - Agent
    - Individual actors
    - Specific unique often with first and last name Jamie O'Connor
    - Generic non-unique and often a role haberdasher
  - Organization
    - Groups, corporations, populations
    - Specific unique IBM
    - Generic a type Non-government organization
  - Location
    - Places things can be at
    - Specific unique with lat and lon or place on map United States of America
    - Generic may be at multiple locations hill
  - Event specific, generic
    - Major happenings that impact groups
    - Specific occur once World War I
    - Generic multiple occurrences Tornado









# **Default Ontology**



### General Entities

- Knowledge
  - · Branches of knowledge
  - Topics of interest
- Resources
  - Things that are not purely mental disease, food, wire
- Tasks
  - Activities eat
- Beliefs
  - "isms" Catholicism
  - Sentiment positive, negative
  - Belief statements right to bear arms





# **Sentiment**

- Assessed often using tools like LYKE or VADER
- Positive/negative score to text based on affective word choice
- More detailed is affect control theory
  - EPA rating
- Overarching or global sentiment too course
- Local or context based sentiment









> Tweets mentioning NATO that can be attributed by country suggest:

- negative sentiment toward NATO in Turkey and
- · positive sentiment toward NATO in Belgium

#### But ...

- · General Sentiment
- Negative tweets in those countries are not negative about NATO
  - 90% of tweets identified by most sentiment miners that mention NATO and are positive or negative are not so ABOUT NATO
- Context based Sentiment
  - 80% are positive or negative ABOUT NATO
- Most negative about NATO are: England, Germany, Switzerland, Hungary
- Most positive about NATO: Sweden, Czech Republic and the Ukraine



Blue is positive Red is negative

Context Sentiment About NATO







### What is Stance?

- Stance is defined as: A mental or emotional position adopted with respect to a proposition, a topic, a person, an idea etc. 1
- Stancetaking is a public act of evaluating objects, positioning subjects and aligning with other subjects.2

1: https://www.thefreedictionary.com/stance

2: Du Bois, J. W. (2007). The stance triangle. Stancetaking in discourse: Subjectivity, evaluation, interaction, 164(3), 139-182.



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### **Pro Stance Stance Is Not Positive Sentiment**



@lan French believes that "climate change is a hoax". The text in this Tweet is mostly positive.

 In stancetaking, a pro-stance can be taken without using words with positive sentiment. Similarly, an anti-stance can be taken without using words with positive sentiment.





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