

Theory and Method for  
**Studying Meaning and  
Related Social Structures**



Introducing “Association Engine” (Æ),  
A Practical Tool for Relational Content Analysis

2010 Academy of Management Meetings | Montreal  
Content Analysis in Organizational Research:  
Techniques and Applications



# Outline

## **Theory meets Method**

- Cool research questions
- Meaning and social structure
- New (research) realities

## **Anatomy of a Project /Introducing Æ**

*Relational Content  
Analysis Made Easy*

- Key Inputs
- Simple interface
- Robust technologies
  
- Community, standards matter!

## **Conclusion**



# Cool topics being addressed by linking macro entities to patterns of association

*Published*

**Social and political movements:** How do fringe interests become mainstream issues?

**Markets:** how do erstwhile misfits become new categories?

*In process*

**Corporate reputation:** how do criteria change and emerge?

**Fields, Forms & Genres:** how do cross-category blends get naturalized?

Grass-fed meat, dairy—activists found a collection of codes seen as ground for new identity, practices.<sup>1</sup>

Workstations—Media co-mentions of rivals reveal category, prototype.<sup>2</sup>

Green—seen by finding overlap in antagonists' association of attributes.<sup>3</sup>

Nanotech—repeated patterns of association among patent classes.<sup>4</sup>

1. Weber et al. 2008 (ASQ)

2. Kennedy 2008 (ASR)

3. Kennedy & Chok

4. Lo & Kennedy



# Repeated patterns of association: a window to dynamics of social realities

*Meaning,  
Structure*

Because meaning and structure are both seen in relations among entities/ideas, they are **dually constituted** (Mohr and Duquenne 1997, Mohr 1998)

*Networks,  
Structure*

Recognition of social realities (sometimes also legitimate) emerges from **repeated associations** that link actors, entities or ideas (Emirbayer 1997, Tilly 2008, Phillips et al. 2006, Powell et al. 2003, Kennedy 2008).  
But this type of work is laborious and risky because:

*Process,  
Network  
Dynamics*

1. the data is hard to get and code;
2. finding relations requires RDB and tricky queries;
3. theory and method are new to most reviewers.

One can trace the **process of field-level change** (Hardy & Maguire 2008) by studying the **dynamics of networks** of changing patterns of association between entities, ideas, etc., (Owen-Smith & Powell 2008) and vice versa



# Still hard, but the flood of web content = big opportunities for content analysis

## *Before*

## *Opportunity*

*Coding*

Human coding

Computer-assisted

*Scale*

Hundreds

Hundreds of thousands+

*Sources*

- Media, PR
- Reporters, Analysts
- Published catalogs

- Also Blogs, RSS feeds
- Commenters, too
- Make-your-own!

*Lag*

Year or more

Months?

*Periods*

Usually years

Months, weeks, days, ...

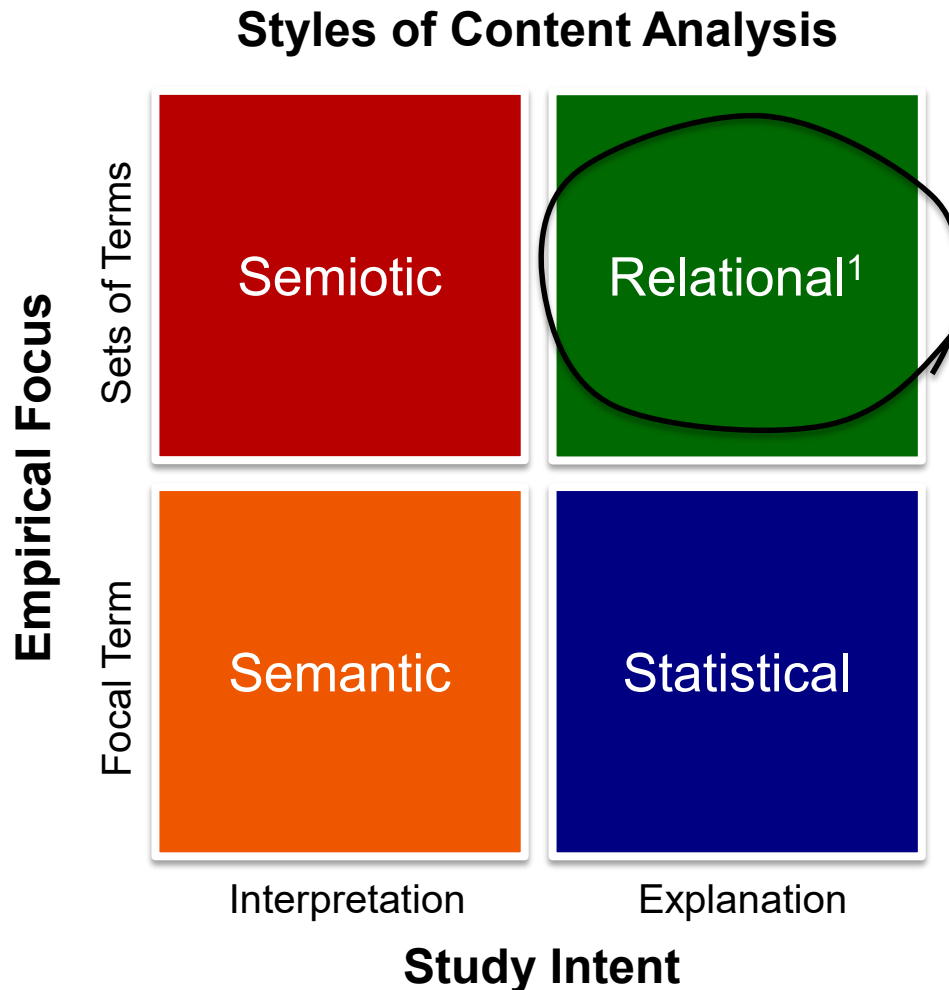
*Product*

Qualitative themes

Semantic networks



# Of the styles of content analysis, this calls for *relational* content analysis\*



1. Carley and Palmquist 1992



# Anatomy of a project: Besides a good question, you need 3 key inputs

## *Corpus*

A collection of text relevant for your topic & research Q

- Can be Lexis-Nexis<sup>®</sup> or Factiva downloads or RSS feeds from blogs

## *Fuzzy Ontology*

Terms *potentially* relevant to “facets” of meaning<sup>1</sup>

- Instances, attributes, synonyms, antonyms
- Parents, children, neighbors
- Producers (sources)

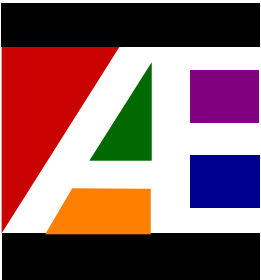
Like an imprecise dictionary (aka “loose” ontology)

## *Recipes*

Facets to associate (e.g., instances, attributes)

Update frequency (period) and when to link (proximity)

1. To recall these, I use the acronym “PCASPIAN”



# Interface (netbook example)

Æ — Association Engine

MTKennedy [Log](#) | [Sign Out](#)

Map

Using

And

By Linking  And

When they Co-occur in a  At Least

Cluster first link item on second ?

Name this Map

*My Dynamic Concept Maps*

Name	Row	Col	Cluster?	Prox	Period
Mindshare	producers	producers	<input type="checkbox"/>	InPara	Qtr
Segments	producers	attributes	<input checked="" type="checkbox"/>	InSent	Month

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# Here's what a fuzzy ontology looks like

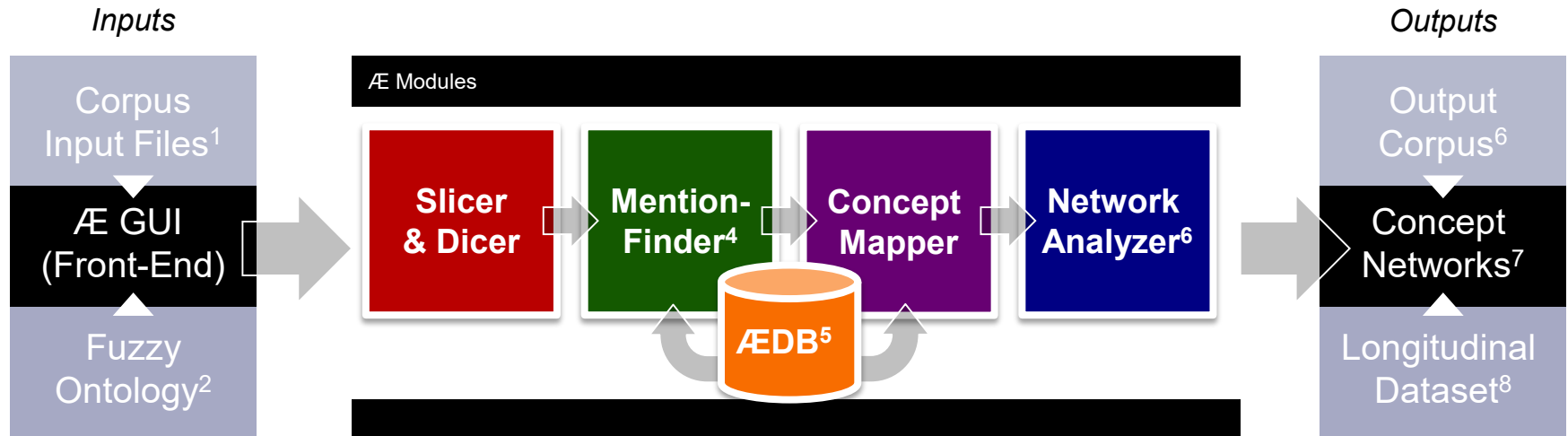
```
<ontology>
  <source>MTK</source>
  <name>computers</name>
  <entry>
    <term>netbook</term>
    <definition>a small, light-weight low cost laptop computer with long battery life; often used for Internet access and wireless communication</definition>
    <partofspeech>noun</partofspeech>
    <facets>
      <attributes>
        lightweight, inexpensive, wireless,
        <aliases>small, <phrase>smaller than a laptop</phrase></aliases>
        <phrase>long battery life</phrase>
      </attributes>
      <producers>
        Dell, Sylvania, Acer, MSI, Lenovo, Samsung, HP, Toshiba, <pattern>Asus|ASUS</pattern>
      </producers>
      <instances>HP 2140 Mini-Note, Samsung NC10, Dell Inspiron Mini 9, MSI Wind, U100-279US, Asus Eee PC 1000HA, Lenovo Ideapad S10, HP Mini 1000 XP Edition, Acer Aspire One AOA150-1126, Asus Eee PC 900HA, Sylvania GNET28001SO, Meso
      </instances>
      <synonyms>laptop, mini-laptop, notebook, mini-notebook, sub-notebook, ultraportable</synonyms>
      <antonyms>mainframe, workstation, server</antonyms>
      <parents>
        laptop, notebook, <aliases>personal computer, PC</aliases>
      </parents>
      <neighbors>smartphone, tablet</neighbors>
    </facets>
  </entry>
  <entry>personal computer
    <definition>a small digital computer based on a microprocessor and designed to be used by one person at a time</definition>
    <attributes>personal, small, microprocessor, desktop, speed, size, memory, storage</attributes>
    <synonyms>PC, desktop</synonyms>
  </entry>
</ontology>
```



# Æ builds on robust open source libraries for search, database, network analysis

Æ is an “association engine”, a search utility that produces dynamic concept networks from 3 inputs:

- (1) a collection of relevant texts from LexisNexis, Factiva, or RSS/Atom feeds from blogs or websites (corpus);
- (2) a set of terms *potentially* relevant to the concept’s meaning (“fuzzy ontology”); and
- (3) rule(s) for when to treat co-mentions of these terms as links (“association rules”).



## Notes

1. From any of the following:
  - LexisNexis® (HTML),
  - Factiva (XML), or
  - the web (RSS/Atom feeds).
2. .æfo file containing terms, definitions, synonyms, etc., or commands for fetching them automatically.
3. Builds on **Lucene**, an open source library (Java) used in a wide range of production search applications.
4. Builds on **Lucene and MySQL**, an open source implementation of SQL. For table structure, see Æ Functional Specification, section 2.4.
5. Builds on **JUNG**, an open source library (in Java) for social network analysis.
6. Corpus input files converted and combined into one .æc file for later re-use as desired.
7. As Pajek .net file for analysis, visualization, exchange.
8. Output (.dat) file contains time-varying measures of concept network structure, position of relevant terms.



# Anatomy of a Project: 3 Key Outputs

## *Visualize*

Æ produces dynamic concept networks (DCNs),

- Graph models of meaning and structure
- Visualize / animate to observe changing patterns of association over time

## *Analyze*

Get flat-file datasets for quantitative analysis (one row per for each node-period observation)

## *Explore*

*\* planned \**

Use DCNs to browse the corpus

- Clicking nodes fetches texts that mention that term
- Clicking a link fetches texts that co-mention the linked terms



## Conclusion: Sober Excitement

*Vision*

Enable study of difficult questions (dynamics), but cut time, expense, risk—increase research productivity

*Fitness ...*

Environmental factors giving content analysis new zip

- Explosion of web content—ripe for analysis
- Open source, esp. for search engine development
- Advances in theory that link macro-level entities to recognition of patterns in lower-level relations

*Or Just  
Deviation?*

Take-off will also require: theory, identity, community, mutual recognition, complementary roles

- Hazard-rate reg.+ institutions / ecology = take-off!
- New content analysis + \_\_\_\_\_ = ???

*Other ideas?*