# How the analysis of structural holes in academic discussions helps in understanding genesis of advanced technology

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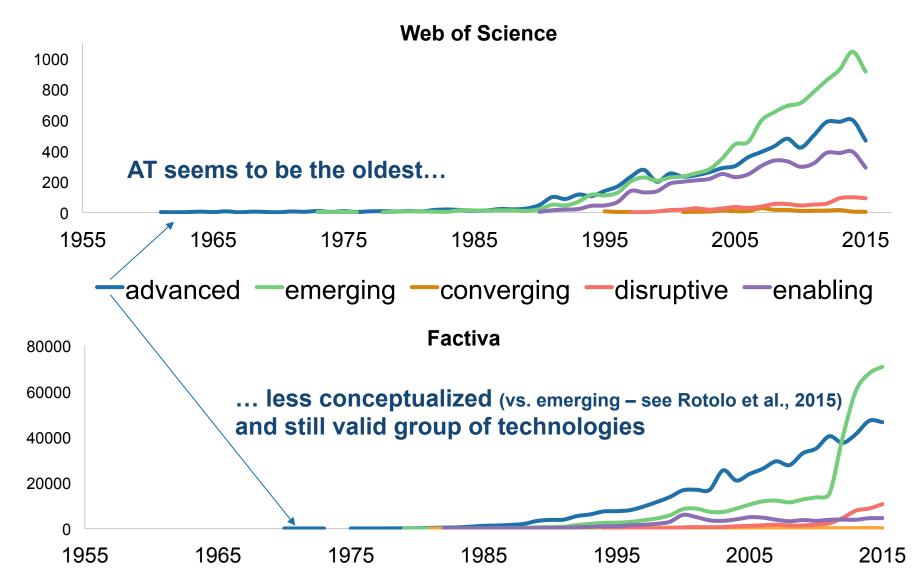


### **Background**

- Continual emergence and dissemination of new technologies
- Importance of certain technology groups for intensive economic growth (next industrial revolution)
- Widespread and increasing interest in developing of statistical indicators explaining evolution and predicting growth of new (emerging) S&T areas
- Lacking conventional definitions and taxonomies for "promising" technology areas against a growing number of umbrella concepts (advanced, emerging, enabling, converging, disruptive, critical and other technologies)



### Why advanced technologies (AT)?





### Research question

Do studies in AT constitute a separate research field or with the category we have another 'endless frontier'?

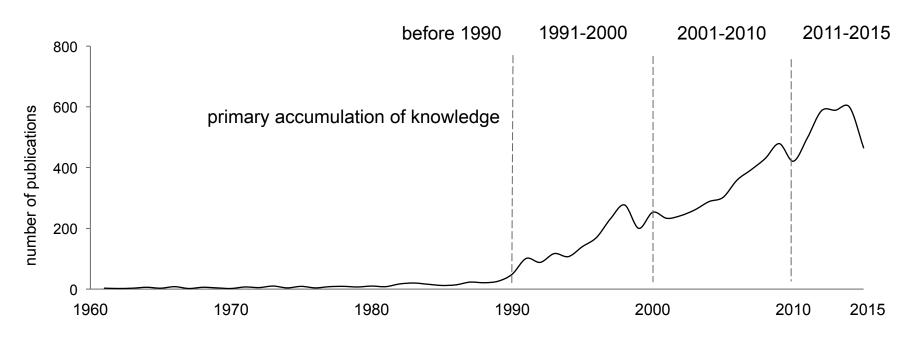
In other words, in professional scientific discourse on advanced technology can we identify a communication core that set up conceptual framework and/or research agenda for a certain period?



### Methodology

- 0. Identification of relevant academic papers in the corps of professional literature
- 1. Analysis of *publication dynamics* in order to identify relevant periods of sustainable growth for in-depth exploration
- 2. Keyword analysis to highlight main research topics in each of the periods
- 3. Co-citation analysis to single out networks that had set up research agenda for each of the periods
  - as invisible colleges (Gmür, 1973) or clusters of science (Small, 1999)
  - as sources of inspiration for emerging topics (Small et al., 2014)
  - as 'knowledge base' of certain fields (Fagerberg & Verspagen, 2009; Fagerberg et al., 2012)
- 4. Application of betweenness centrality to identify core elements of the networks
  - optimally positioned actors that can accumulate information flows from dislocated parts of a network (Bavelas, 1948, 1950)
  - structural holes that provide opportunities for mediating knowledge flows in a wider community of actors (Burt, 2002)
- 5. Comparing betweenness centrality of papers cited in two consecutive periods with papers cited in one period only

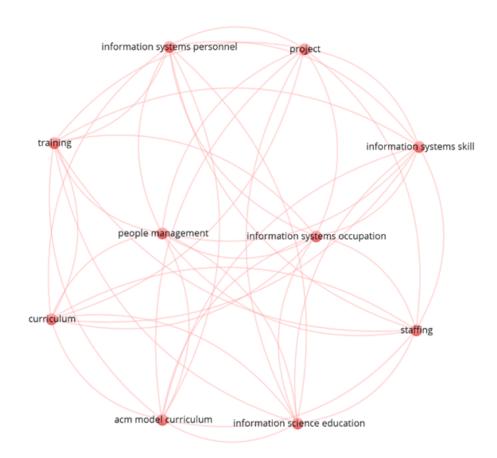
### **Publication dynamics**



Query TS="advanced technolog\*" or TI="advanced NEAR technolog\*".



# Keyword analysis before 1990: homogeneity of discussions



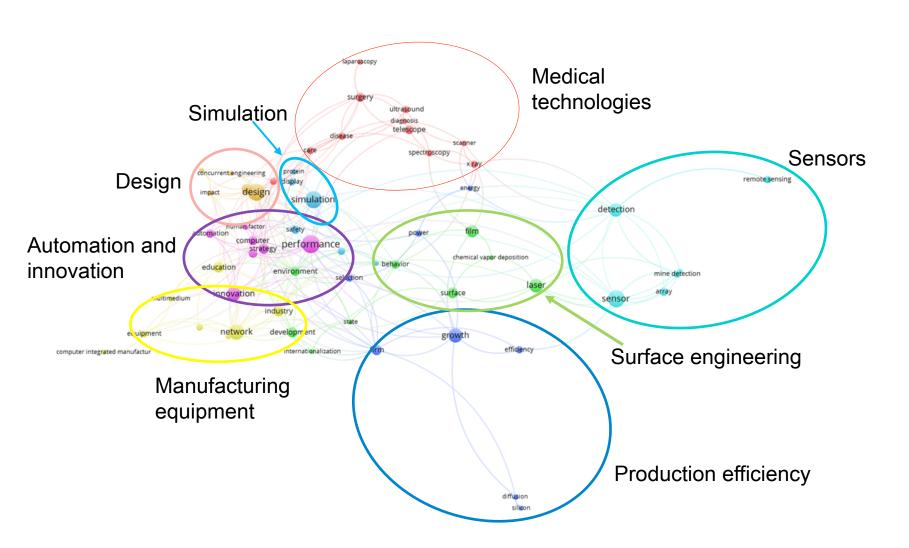
#### Top 5 domains

- Engineering
- 2. Business/economics
- 3. Other topics of science and technology
- 4. Material science
- 5. Optics

**Key issues:** role of technologies in economic development engineering education and skills human resource management

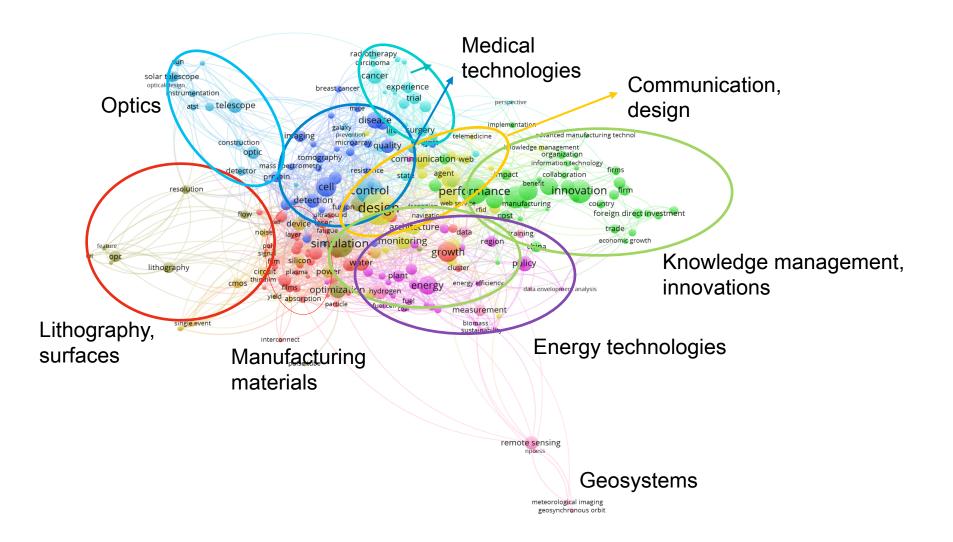


# **Keyword analysis 1991-2000:** primary specialization (manufacturing)



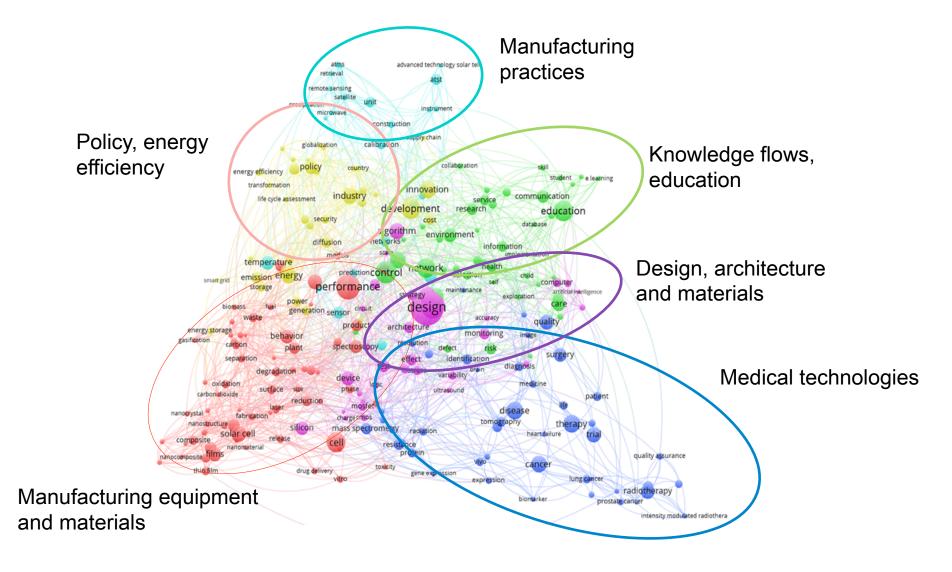
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# **Keyword analysis 2001-2010: AT beyond manufacturing**





# Keyword analysis 2011-2015: focus on implementation & management



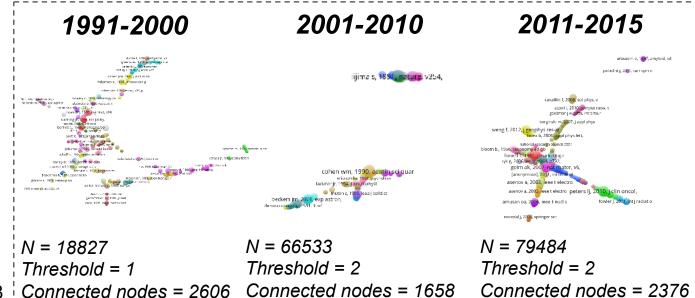
### Co-citation networks: key parameters

Selected for further analysis

#### before 1990



N = 1268 Threshold = 1 Connected nodes = 128



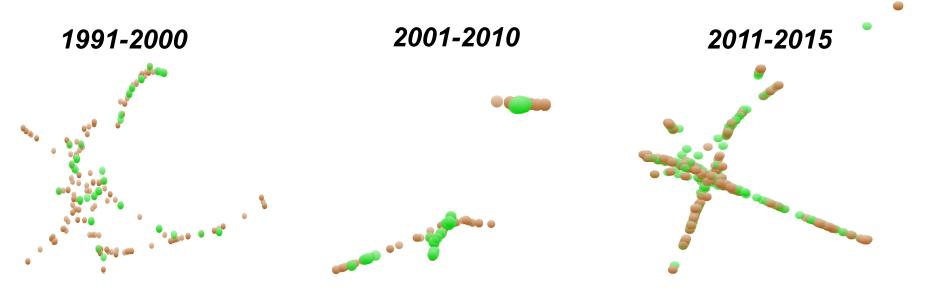
**Key issues:** role of AT in changing social and economic structure

**Key issues:** technology and innovation management

Key issues: management of tech, innovation, globalization Key issues: technology domination



### **Identification of structural holes**



Moving to the next period = 85 Share of total = 3.3%

Moving to the next period = 118 Share of total = 7.1%

**Potentially** moving = 358 Share of total = 15.1%

		1	2	3	4	5
	Period	1960-1990	1991-2000	2001-2010	2011-2015	2016
1	1960-1990	-	0			
2	1991 - 2000		1	85	26	10
3	2001 - 2010			-	118	42
4	2011-2015				-	358

Period	Mean betweenness of authors who move	Mean betweenness of authors who don't move	Wilcoxon statistics	p value
1991 - 2000	31822.6	3124.6	18827	< 0.01
2001 - 2010	17883.2	5986.6	3050	< 0.01

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# Identifying key technology driven areas from papers with higher betwenness centrality

#### 1991-2000

• Global technology markets and emergence of new form of firms – multinational; Foreign investments and their spillover effects; Measuring productive efficiency; Innovation development; Technological change

#### 2001-2010

• All previous + Biotechnology, Nanotechnology, Oncology, Semiconductors, Mathematical modeling, Astronomy (Advanced Technology Solar Telescope), Microelectronics, Environment, Medicine

#### 2011-2015 (topics likely to emerge in the further decade)

• Environment; Energy; Fuels; CMOS Transistors; Electrical Engineering; Genetics; Geochemistry; Material Sciences; Meteorology; Oncology; Technology and Society



#### **Discussion and conclusions**

 There is observable penetration of the concept on 'Advanced Technology' from social sciences discourse to natural and engineering disciplines identified both through the analysis of co-citation networks and keywords mapping:

from R&D and technology management (1991 – 2000) to innovation studies (2001 – 2010) and discussions on specific technologies (2011 – 2015)

- Co-citation networks eliminated a common background for the papers in the observable periods and therefore can be considered as a 'knowledge base' of the professional discussions, however, different traditions in citations might lead to systemic bias towards certain disciplines
- Application of centrality metrics allowed identification of key works of the period and empirically verify the adoption of the 'politically sounding' term by specific studies in technology
- No stable communication core was identified there is still continuous diversification of the topics associated with the concept of advanced technology
- Further work can be aimed at deeper analysis of the disciplinary structures in communication networks and identification of specific technologies considered as advanced in certain time periods

### Thank you!

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