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The economy as a complex system

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Economics of Networks - GEO3-3805

Utrecht, 30 September 2021



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structure of lecture

1. relatedness and regional diversification
2. smart specialisation policy
3. role of inter-regional linkages



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references

- Hidalgo, C., Balland, P.A., Boschma, R., Delgado, M., Feldman, M., Frenken, K., Glaeser, E., He, C., Kogler, D., Morrison, A., Neffke, F., Rigby, D., Stern, S., Zheng, S., and Zhu, S. (2018) The Principle of Relatedness, Proceedings of the 20th International Conference on Complex Systems, forthcoming
- Hidalgo, C. A., Klinger, B., Barabasi, A. L., & Hausmann, R. (2007). The product space conditions the development of nations. *Science*, 317(5837), 482-487.
- Balland, P.A., R. Boschma, J. Crespo and D. Rigby (2019) Smart specialization policy in the EU: Relatedness, knowledge complexity and regional diversification, *Regional Studies* 53 (9), 1252-1268.





regional diversification

- regions need to **diversify** into new activities to secure long-term economic development
- but their **capacity** to do so **differs**
- how do regions create **new activities**?: new activities do **not start from scratch**
- **local capabilities** (knowledge, skills, networks, institutions) condition which new activities will be feasible to develop in a region
- local capabilities provide **opportunities** but also set **limits** to the diversification process in a region





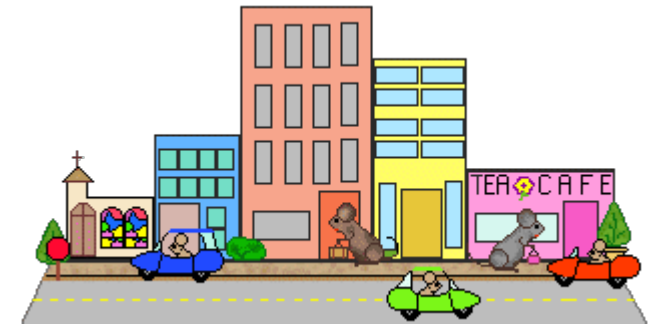
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related diversification

unrelated diversification

region A

region B



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studies: **related diversification is rule**, unrelated diversification the exception (Hidalgo et al 2018)



regional diversification

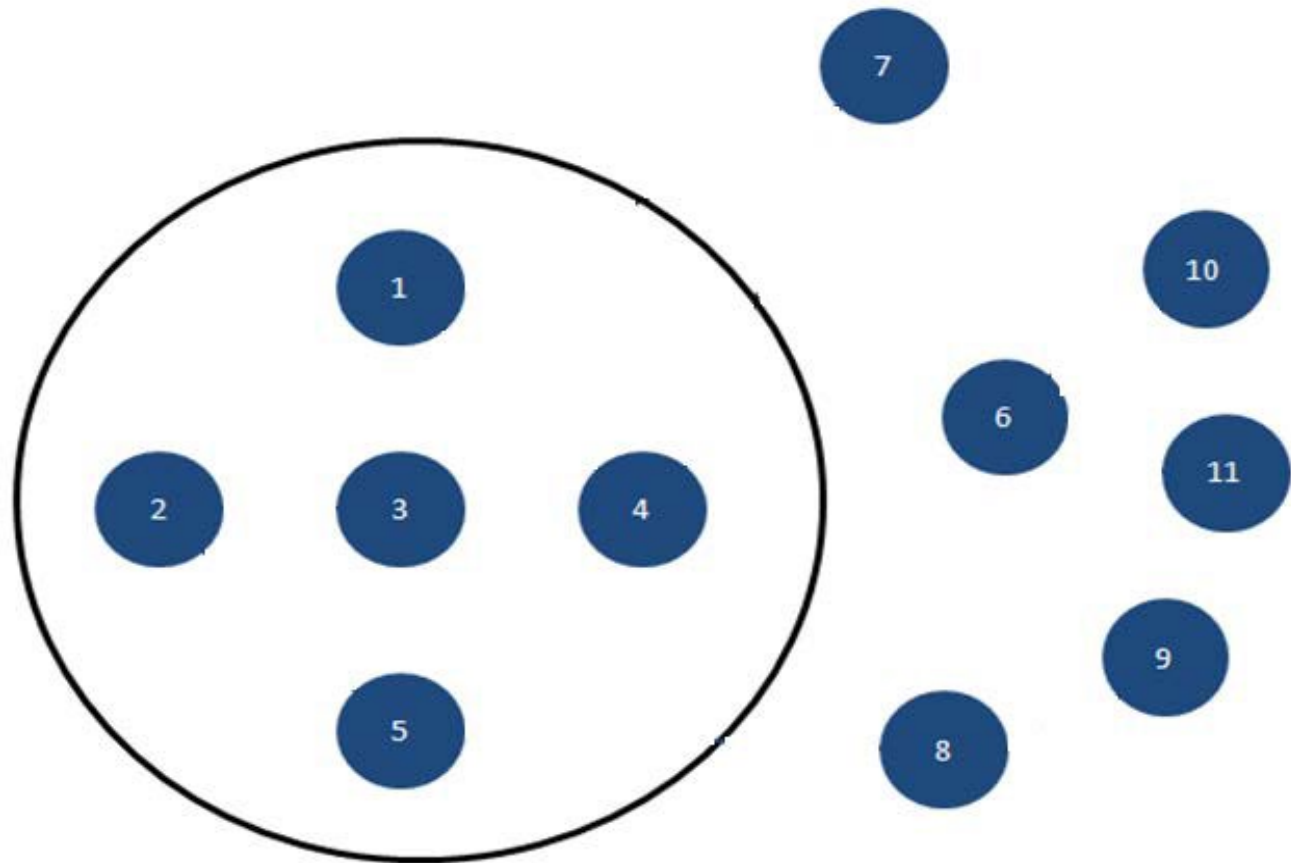
- Hidalgo, Klinger, Barabasi and Hausmann (2007)
 - how countries build CA in **new export products**
 - **national capabilities** condition which new export products will be feasible to develop
 - **product space: relatedness** between products based on co-occurrence of products in countries' export portfolios
 - countries develop new export products that are **closely related** to existing export products
 - countries with **related variety** have more opportunities to diversify and sustain higher economic growth rates





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economies as complex systems

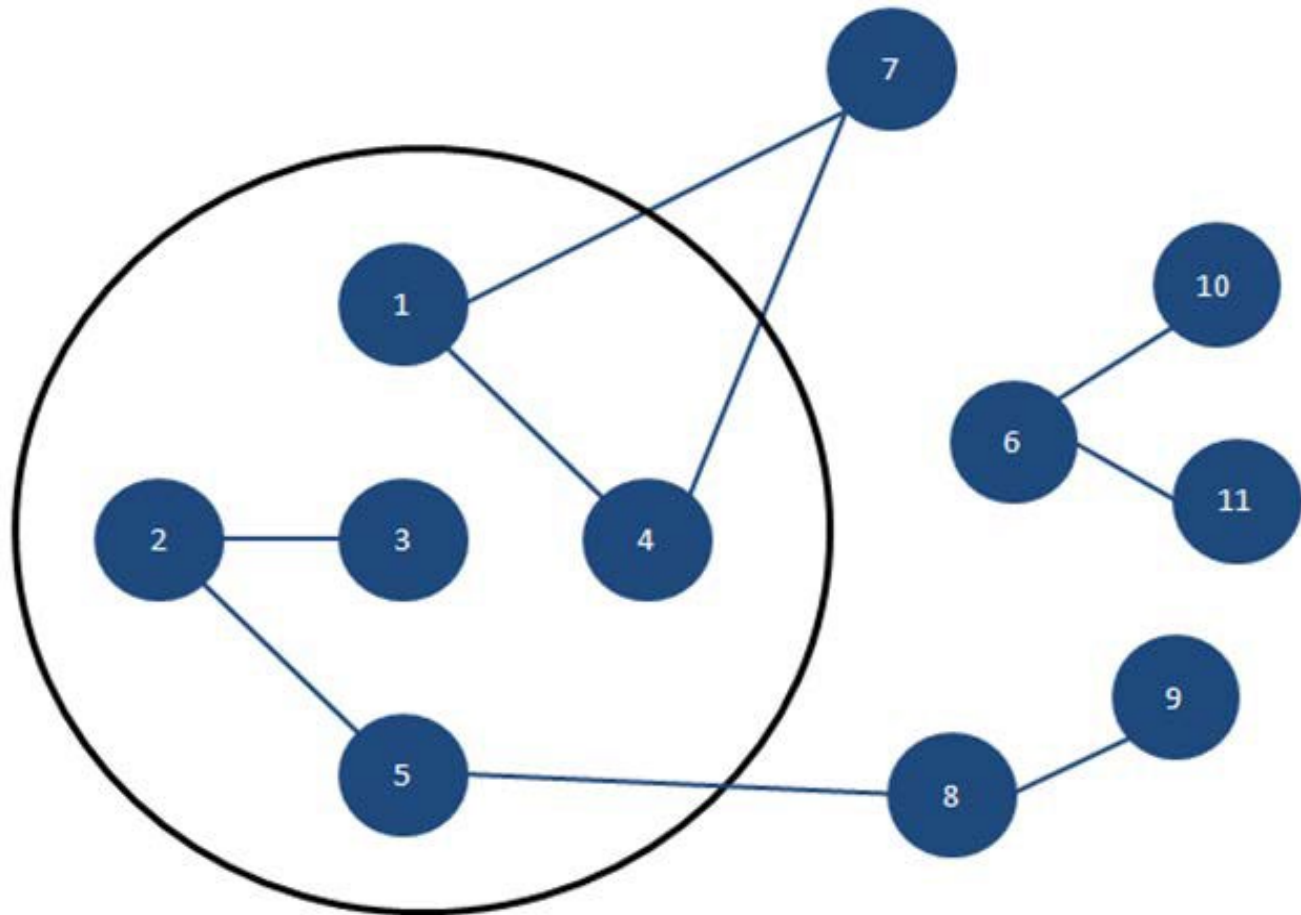


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economies as complex systems



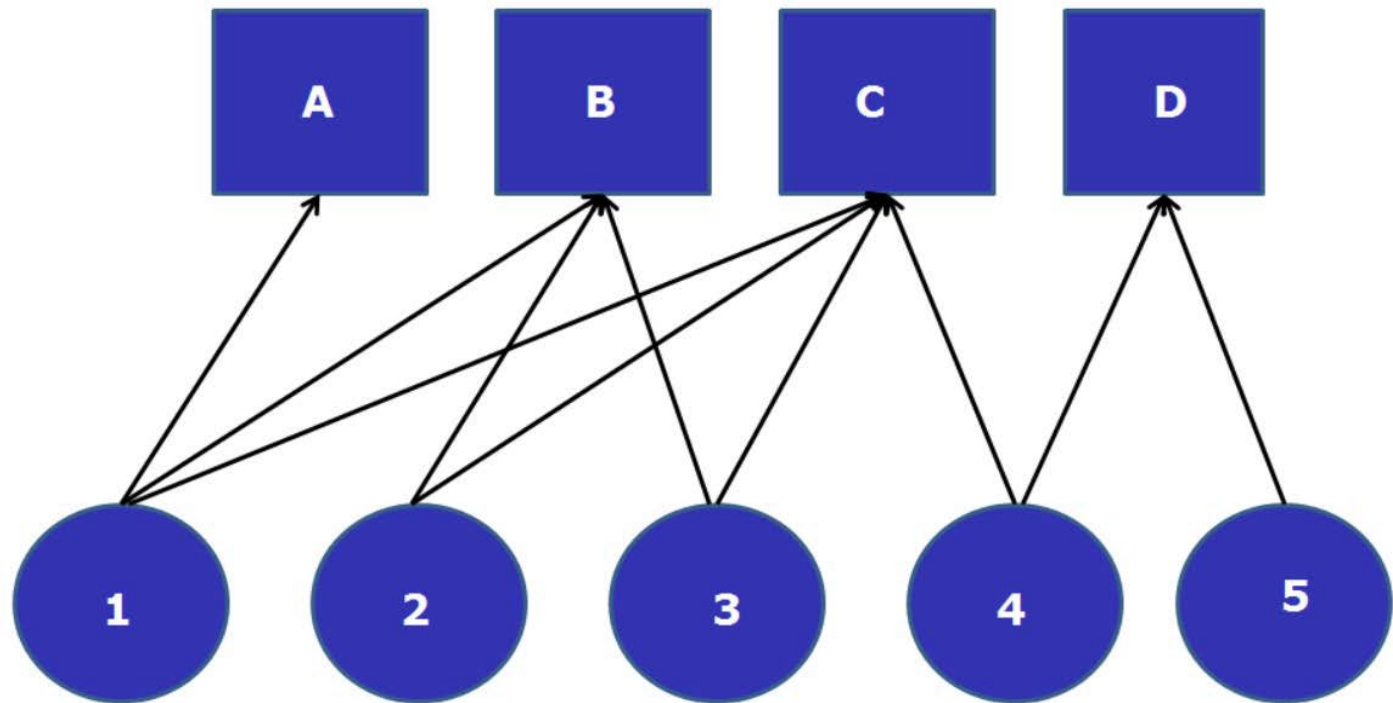
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economic systems as 2-mode networks

non-spatial units (economic sectors)



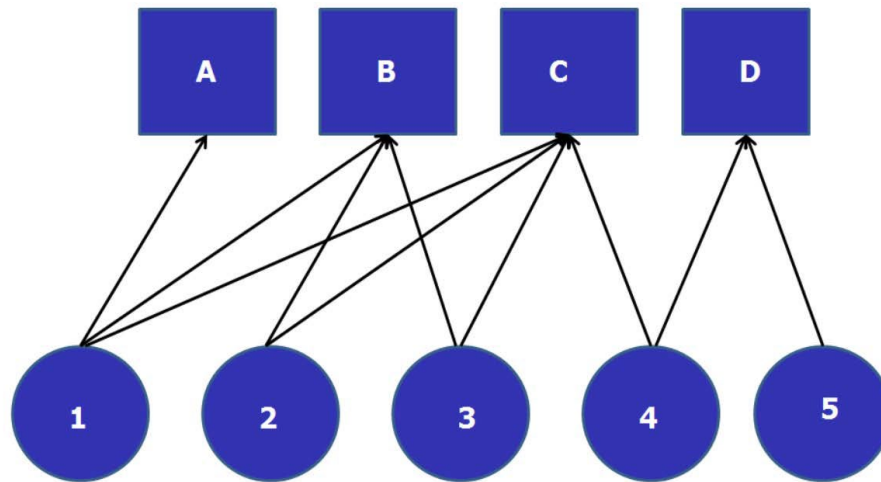
spatial units (cities, states, neighborhoods)



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economic systems as 2-mode networks



$$\begin{matrix} & A & B & C & D \\ \begin{matrix} 1 \\ 2 \\ 3 \\ 4 \\ 5 \end{matrix} & \begin{pmatrix} 1 & 1 & 1 & 0 \\ 0 & 1 & 1 & 0 \\ 0 & 1 & 1 & 0 \\ 0 & 0 & 1 & 1 \\ 0 & 0 & 0 & 1 \end{pmatrix} \end{matrix}$$



compute co-occurrences between non-spatial entities (economic sectors)

$$\begin{array}{c} \begin{array}{c} 1 \\ 2 \\ 3 \\ 4 \\ 5 \end{array} \begin{array}{c} A B C D \\ \left(\begin{array}{cccc} 1 & 1 & 1 & 0 \\ 0 & 1 & 1 & 0 \\ 0 & 1 & 1 & 0 \\ 0 & 0 & 1 & 1 \\ 0 & 0 & 0 & 1 \end{array} \right) \end{array} \end{array} \Rightarrow \begin{array}{c} \begin{array}{c} A \\ B \\ C \\ D \end{array} \begin{array}{c} A B C D \\ \left(\begin{array}{cccc} 0 & 1 & 1 & 0 \\ 1 & 0 & 3 & 0 \\ 1 & 3 & 0 & 1 \\ 0 & 0 & 1 & 0 \end{array} \right) \end{array} \end{array}$$

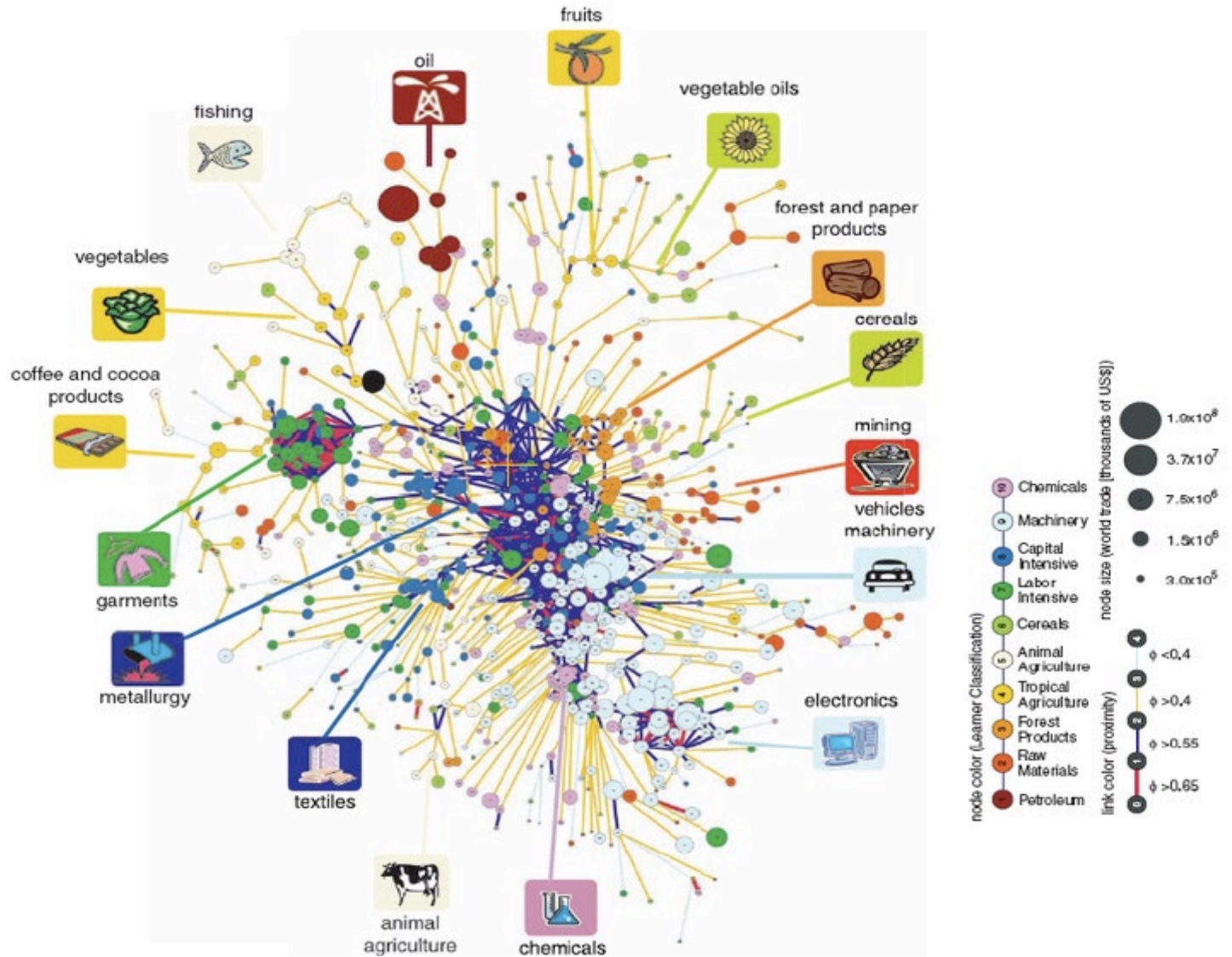
*how many times B and C co-occur in the same spatial unit?
= in how many spatial units do B and C co-exist?*

response = 3 (in 1,2, and 3)



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product space

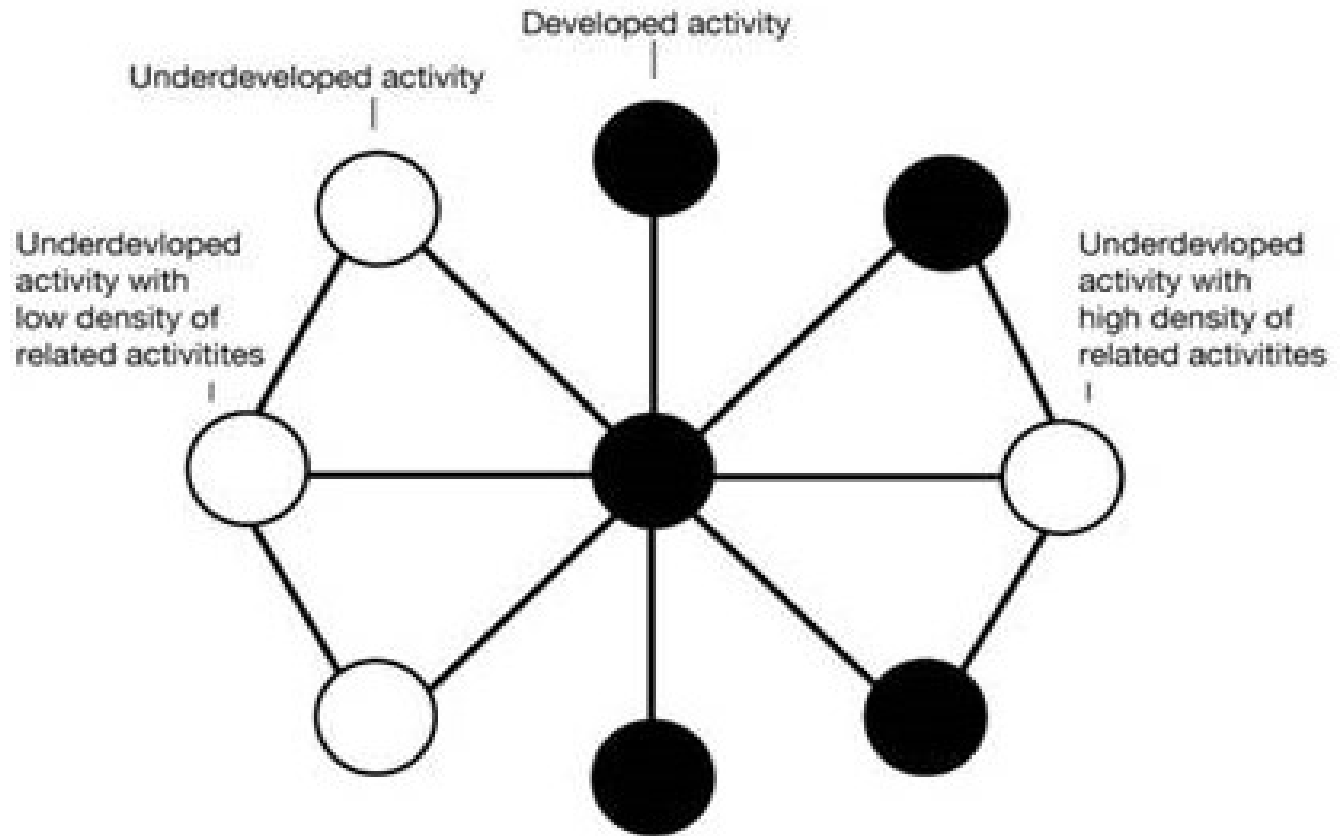


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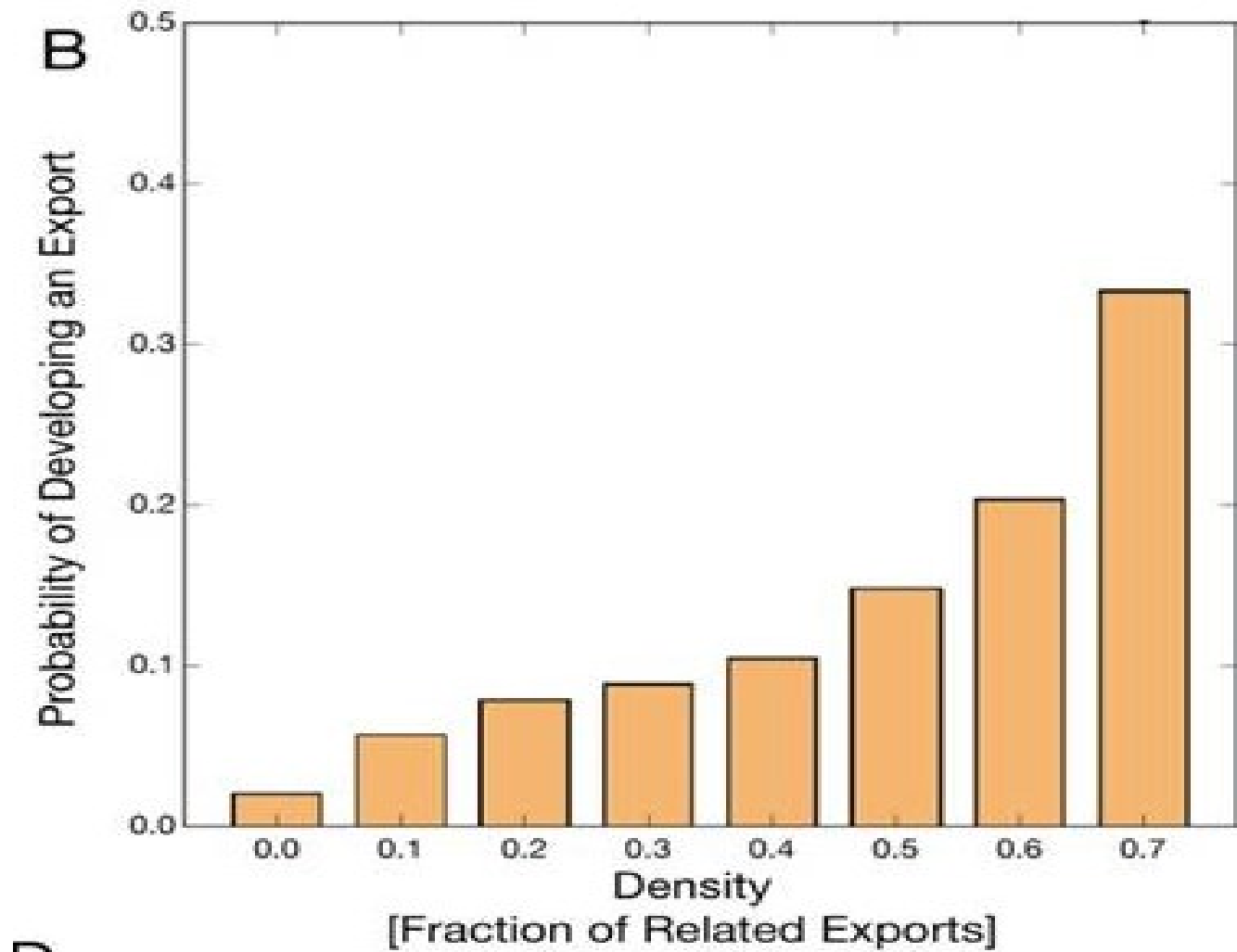
related diversification in regions



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related diversification in regions





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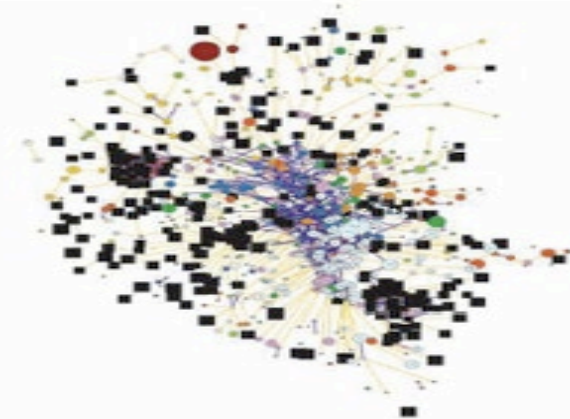
(Hidalgo et al)



Industrialized
Countries



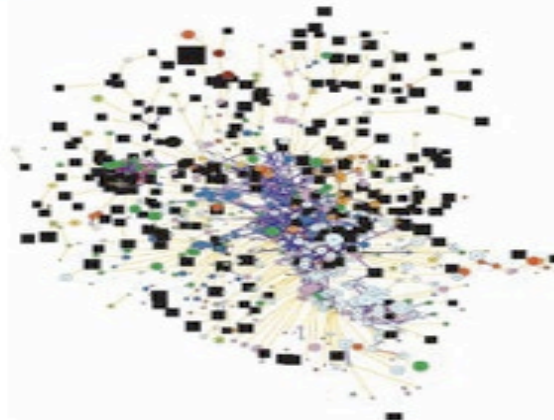
East Asia
Pacific



Latin America
and
the Caribbean



Sub-Saharan
Africa



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regional diversification

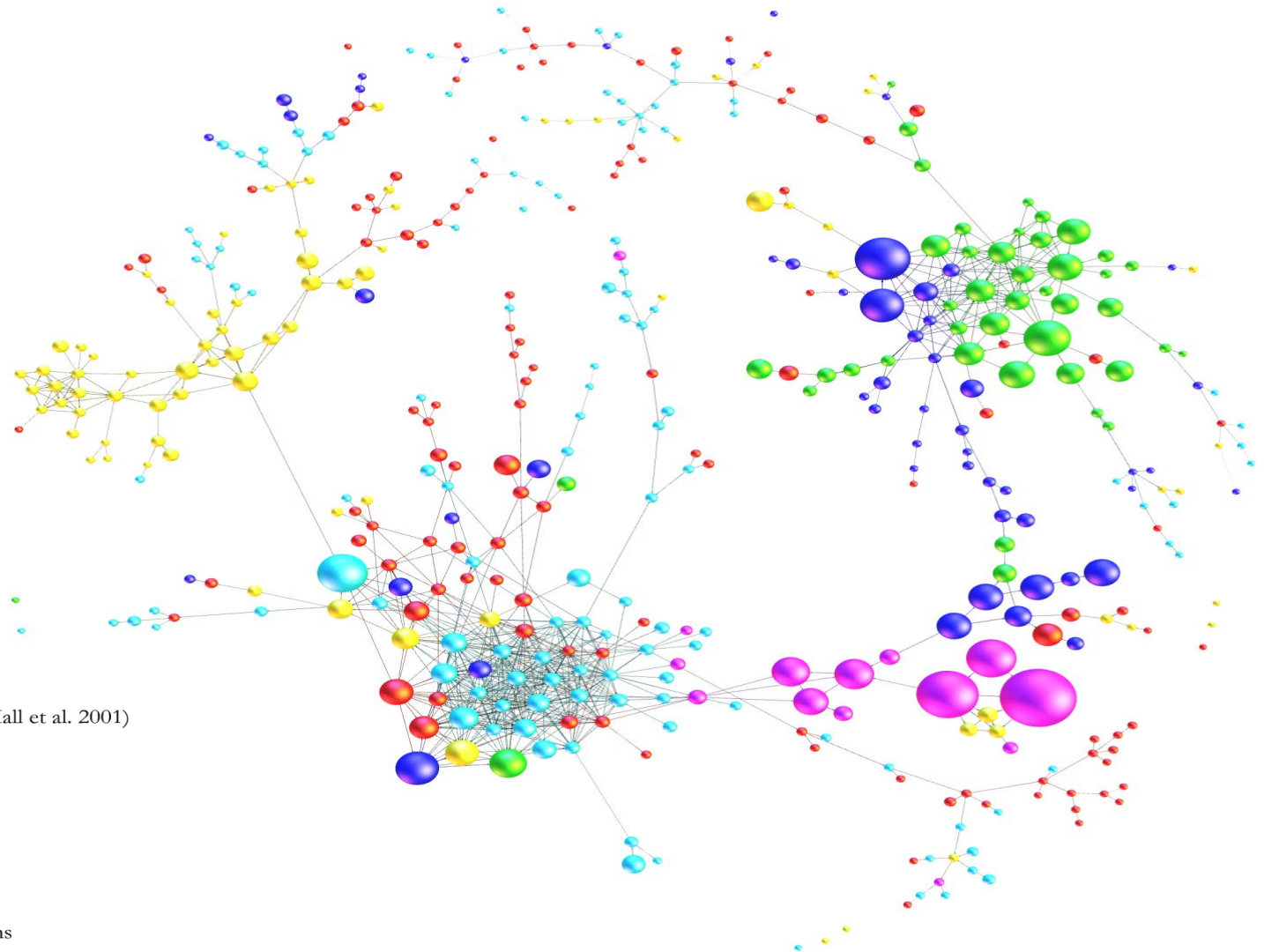
- other **relatedness measures** (Boschma 2017), e.g.:
 - **technology space**: relatedness between technologies: co-occurrence of technology classes on patent documents
 - **solar technology space**: relatedness between solar technologies and with other technologies
 - **industry space**: relatedness between industries: based on similarities of skills requirements: intensity of labor flows





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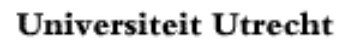
technology space (Boschma et al. 2015)



Node size: # of patents

Node color: USPTO classification (Hall et al. 2001)

- Mechanical
- Chemical
- Drugs and Medical
- Electrical and Electronic
- Computers and Communications
- Others



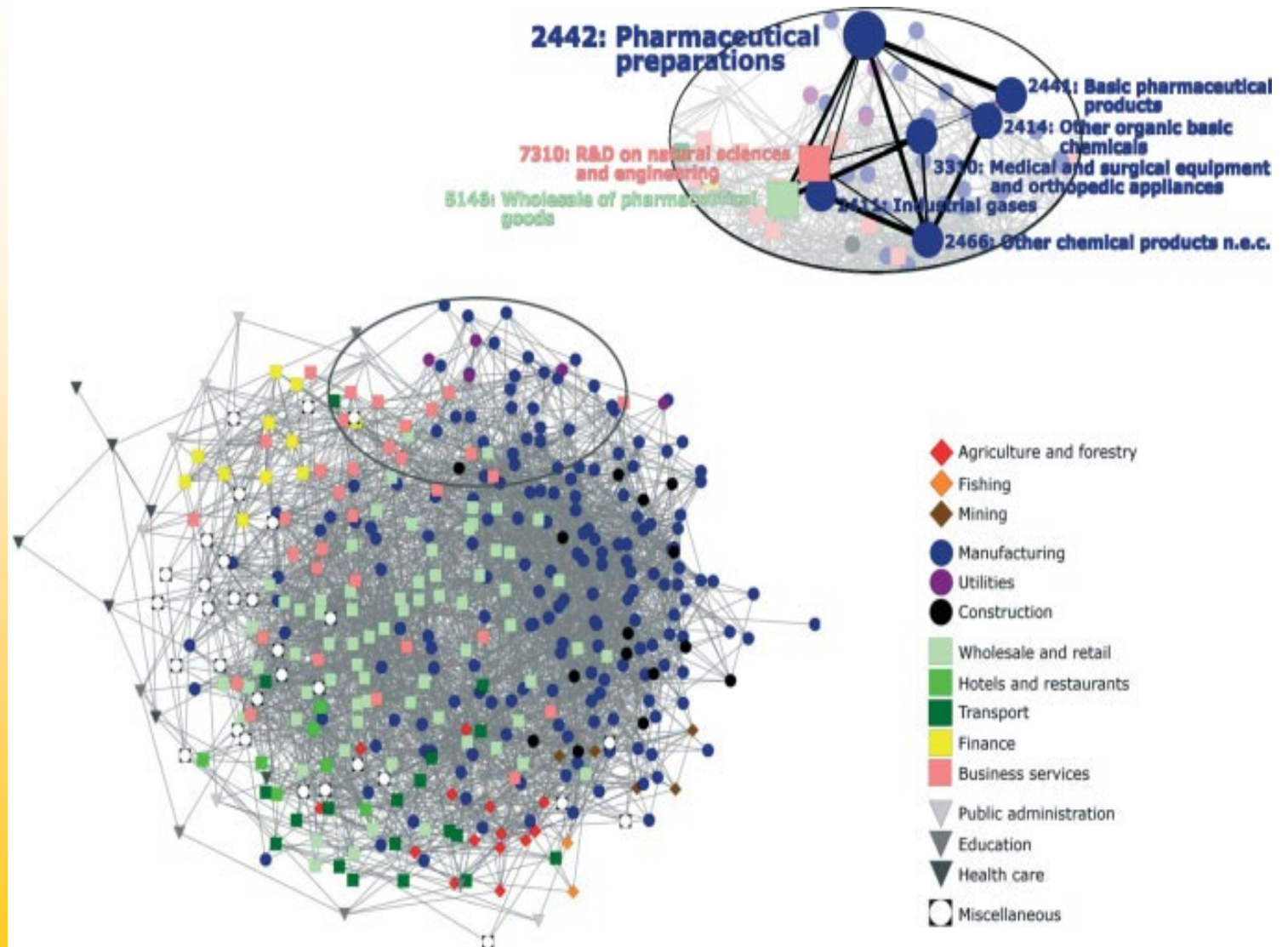
- Electrical engineering
- Instrumenten
- Chemie
- Mechanical engineering
- Overig

Bron: OECD REGPAT database



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skill space

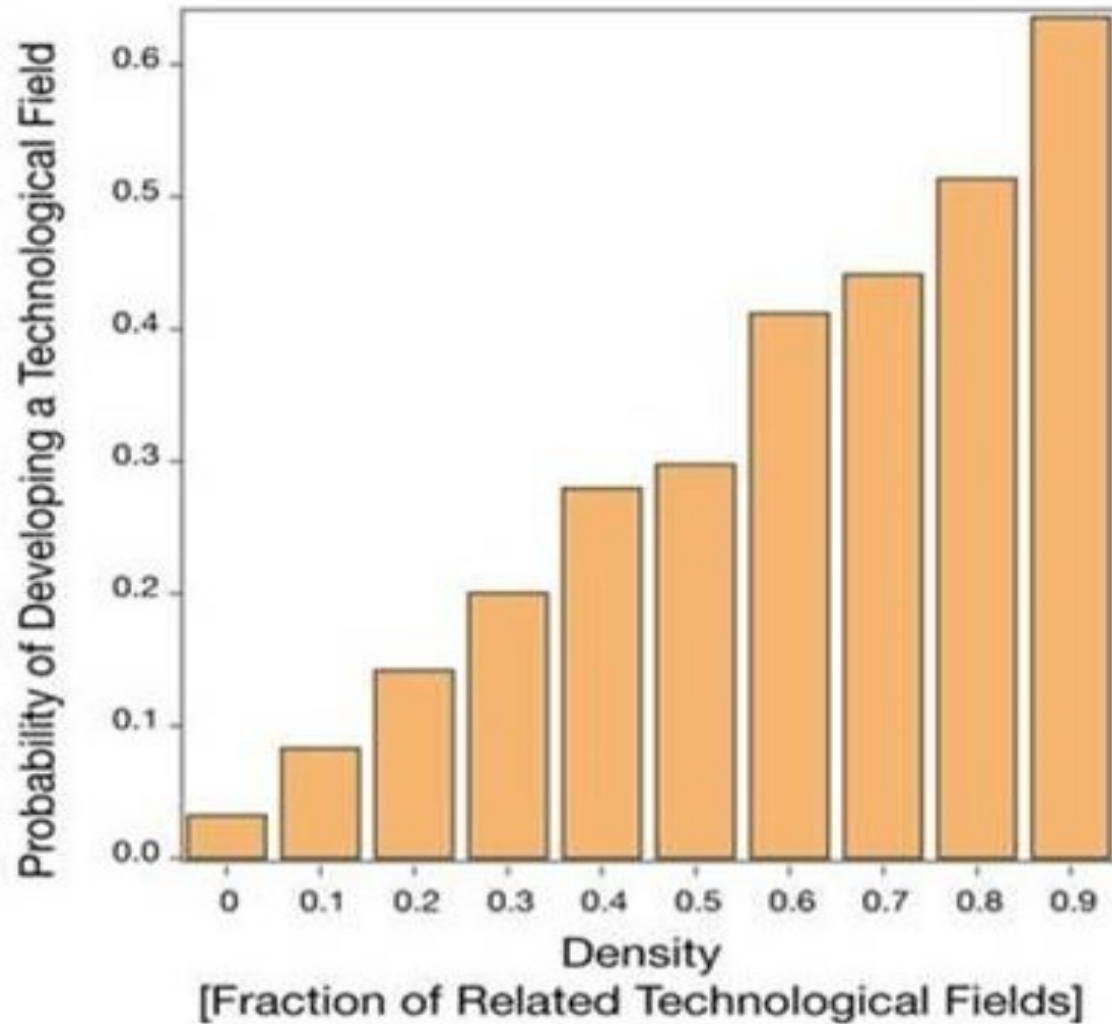


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regional diversification



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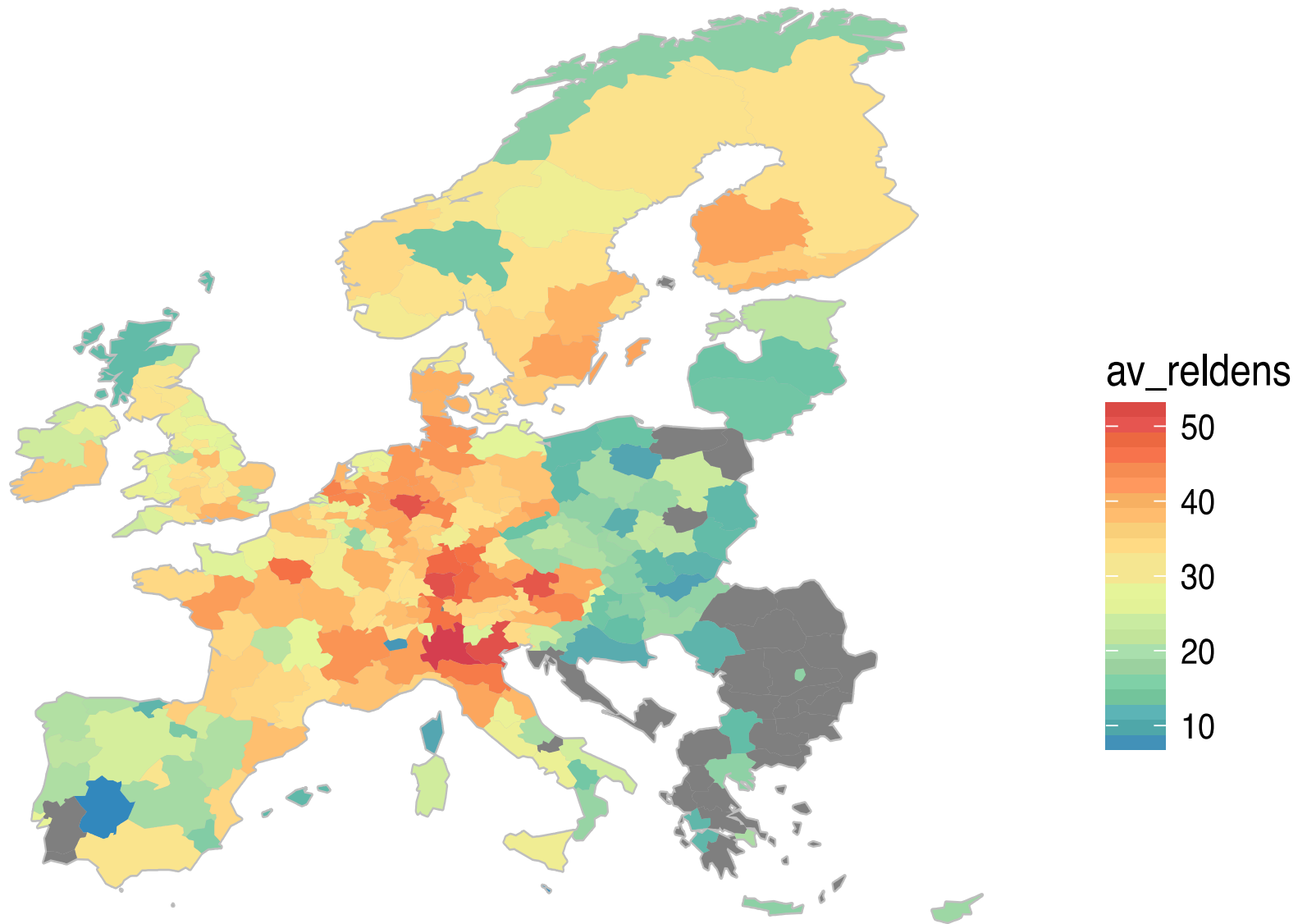


technological diversification opportunities of regions

- **average relatedness density** (Balland et al. 2019): the average degree of relatedness between existing technologies in a region and all missing technologies in that region
- the higher that region's score on this measure, the closer, on average, its existing set of technologies to those technologies that are missing in the region: overall average score of a region's potential to develop new technologies

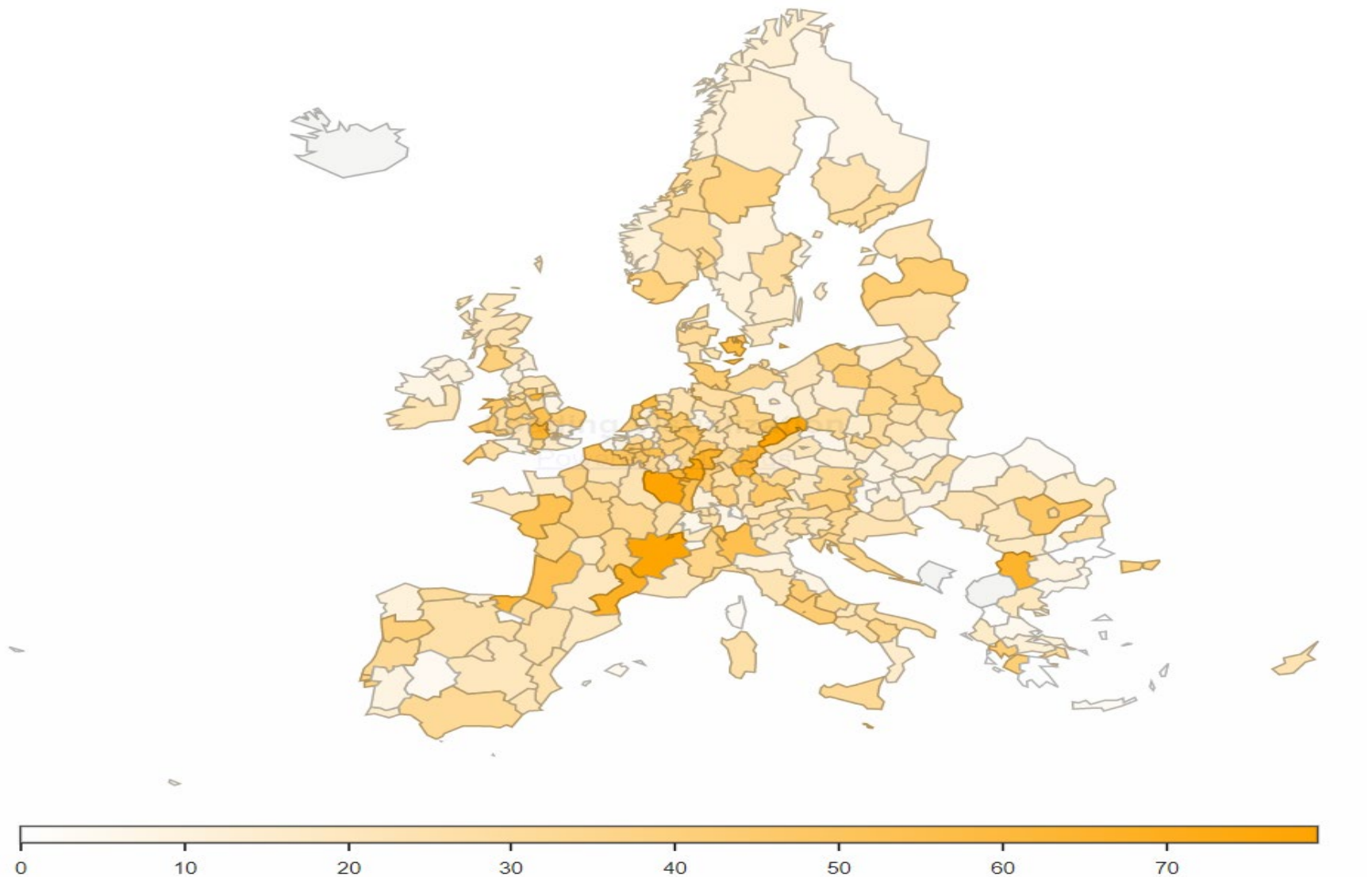


diversification opportunities of European regions



Source: Balland et al. (2019)

diversification potential of European regions in hydrogen technology





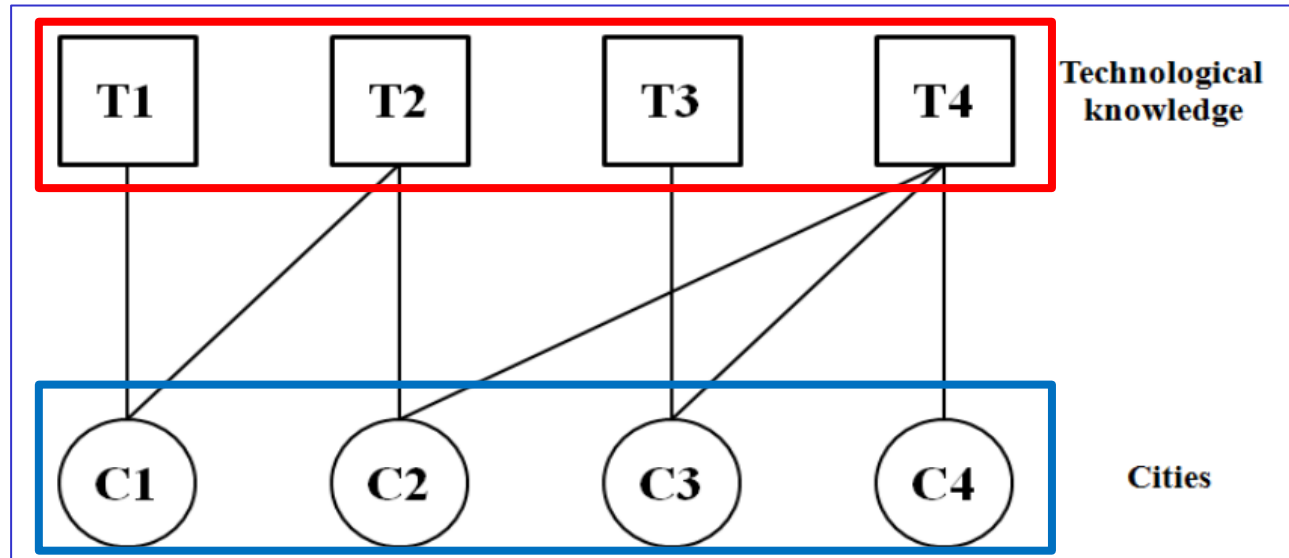
smart specialization policy

- EEG has been influential in the EU: smart specialization policy
- focus on identifying possible diversification strategies for regions, based on their capabilities
- relatedness: to assess potential risks of alternative diversification strategies for regions
- complexity: to assess potential benefits of policy, based on diversity and ubiquity (Hidalgo and Hausmann 2009)





complexity: diversity and ubiquity

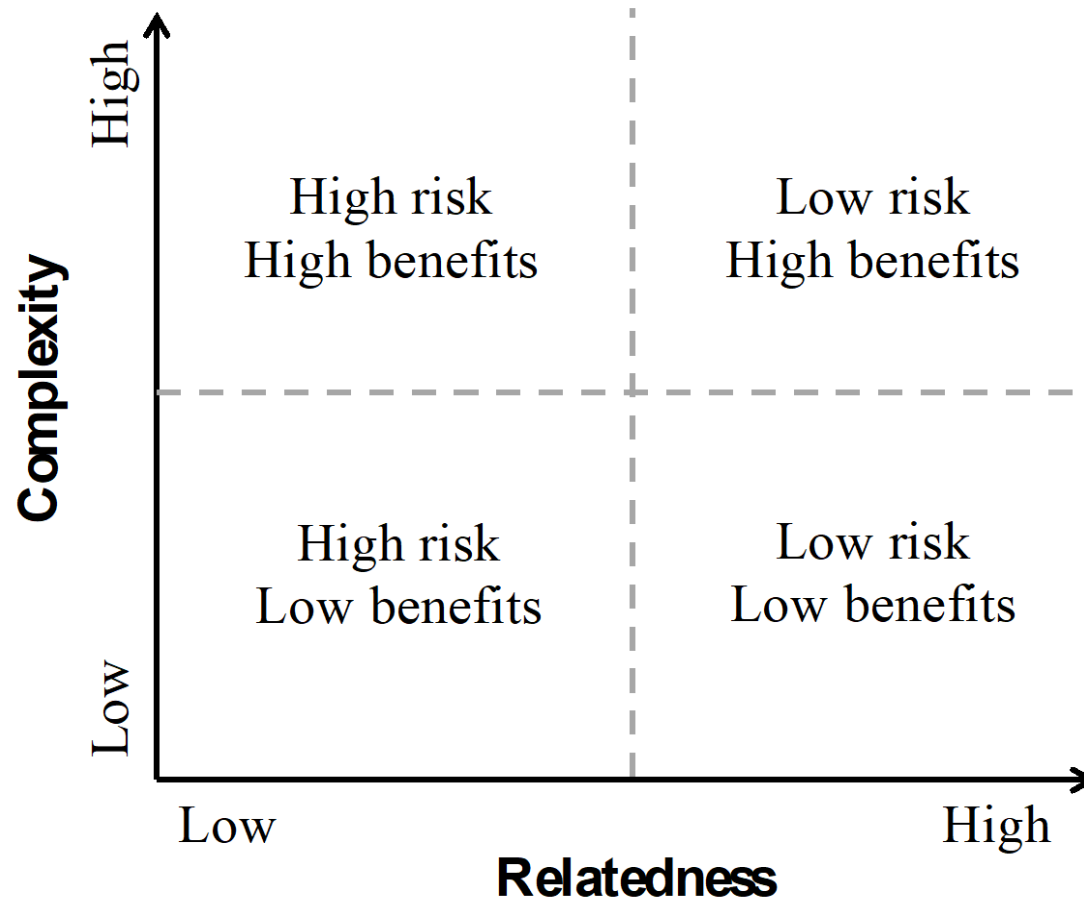


diversity is the degree centrality of the spatial units

ubiquity is the degree centrality of the econ/tech units

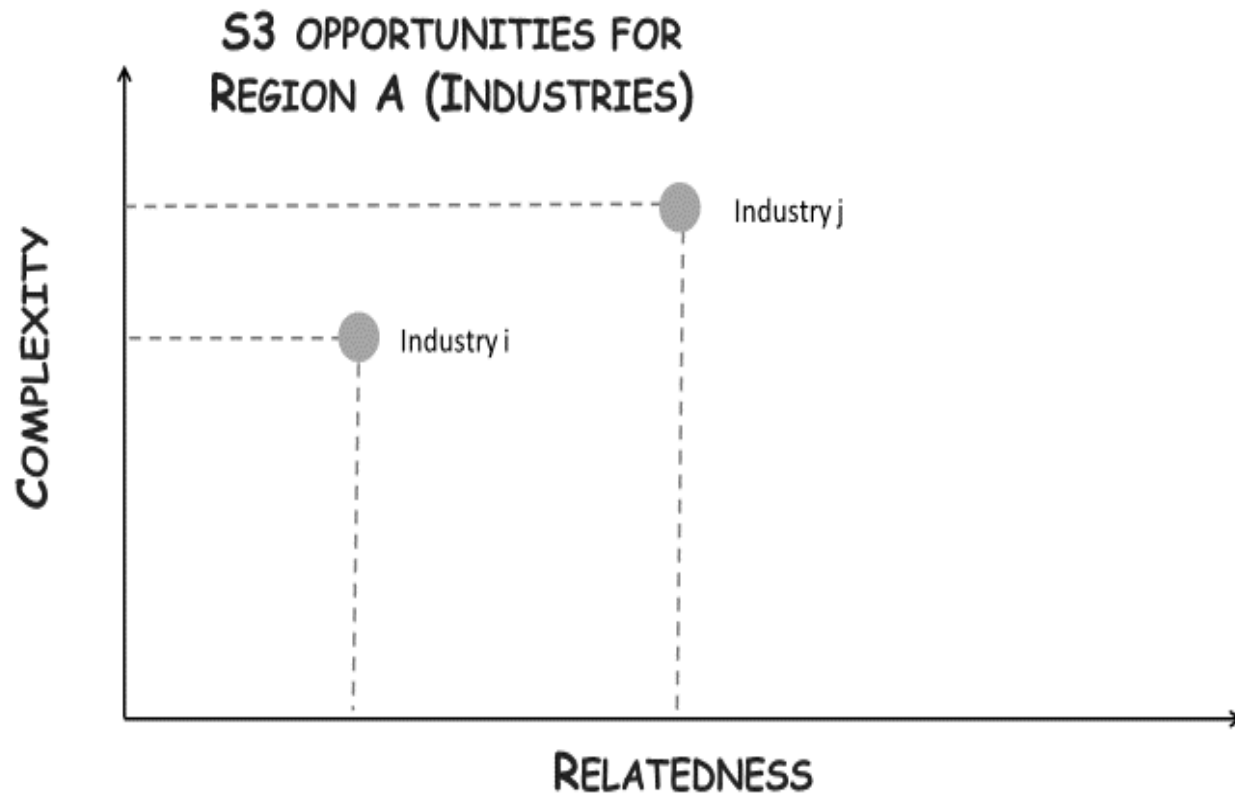


smart specialization policy



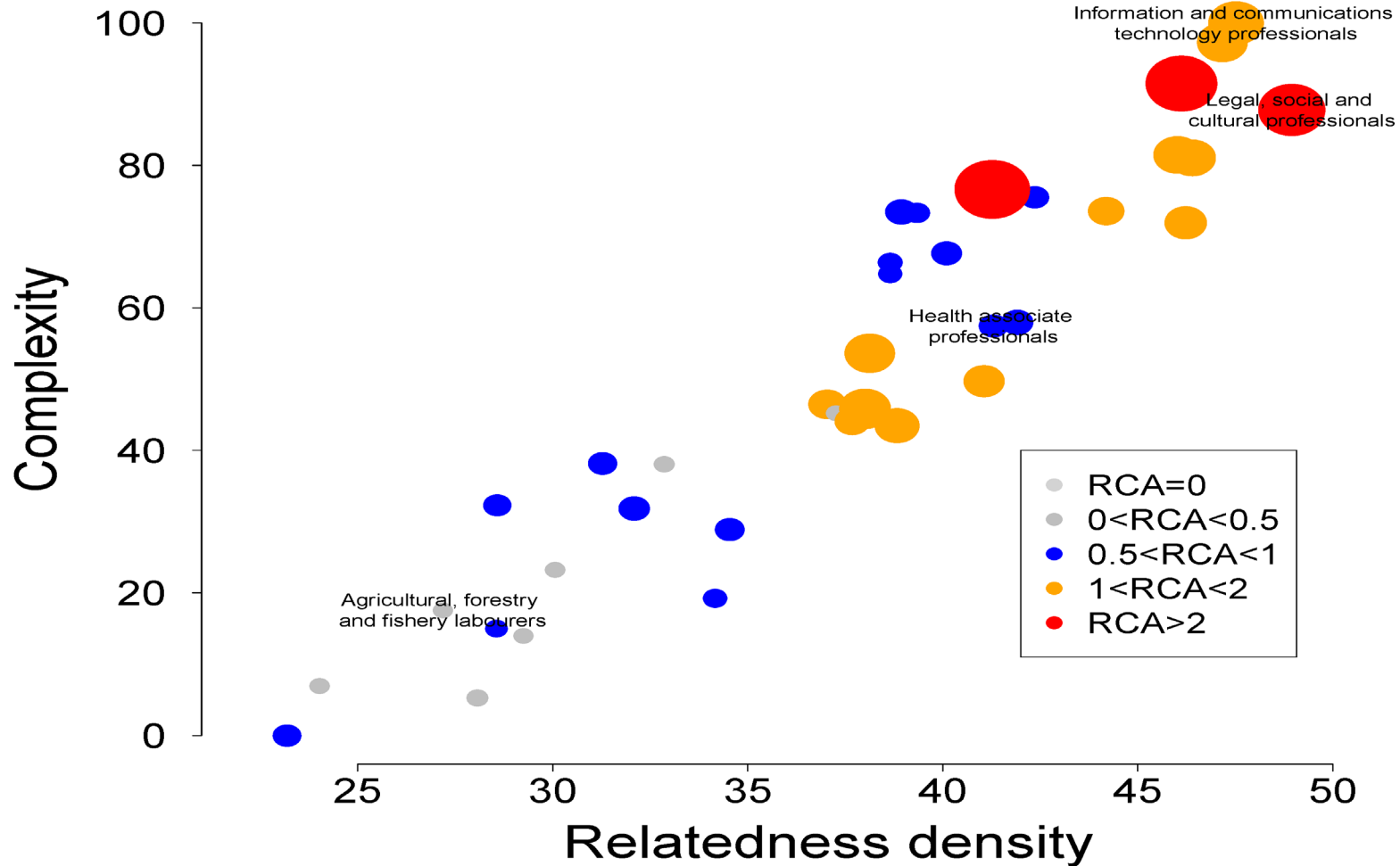


toward a new S3 framework



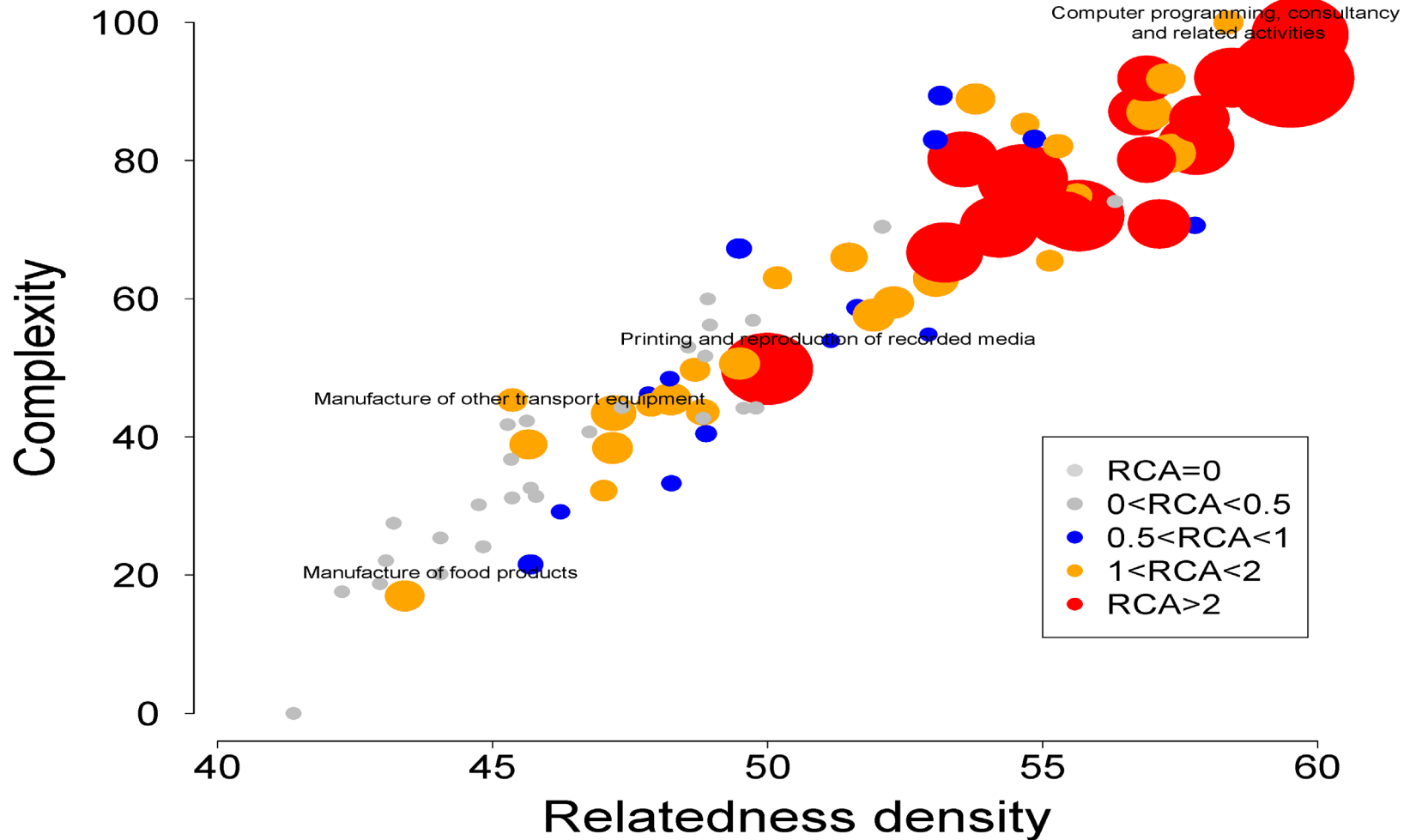
diversification opportunities in occupations

Île-de-France (FR10)



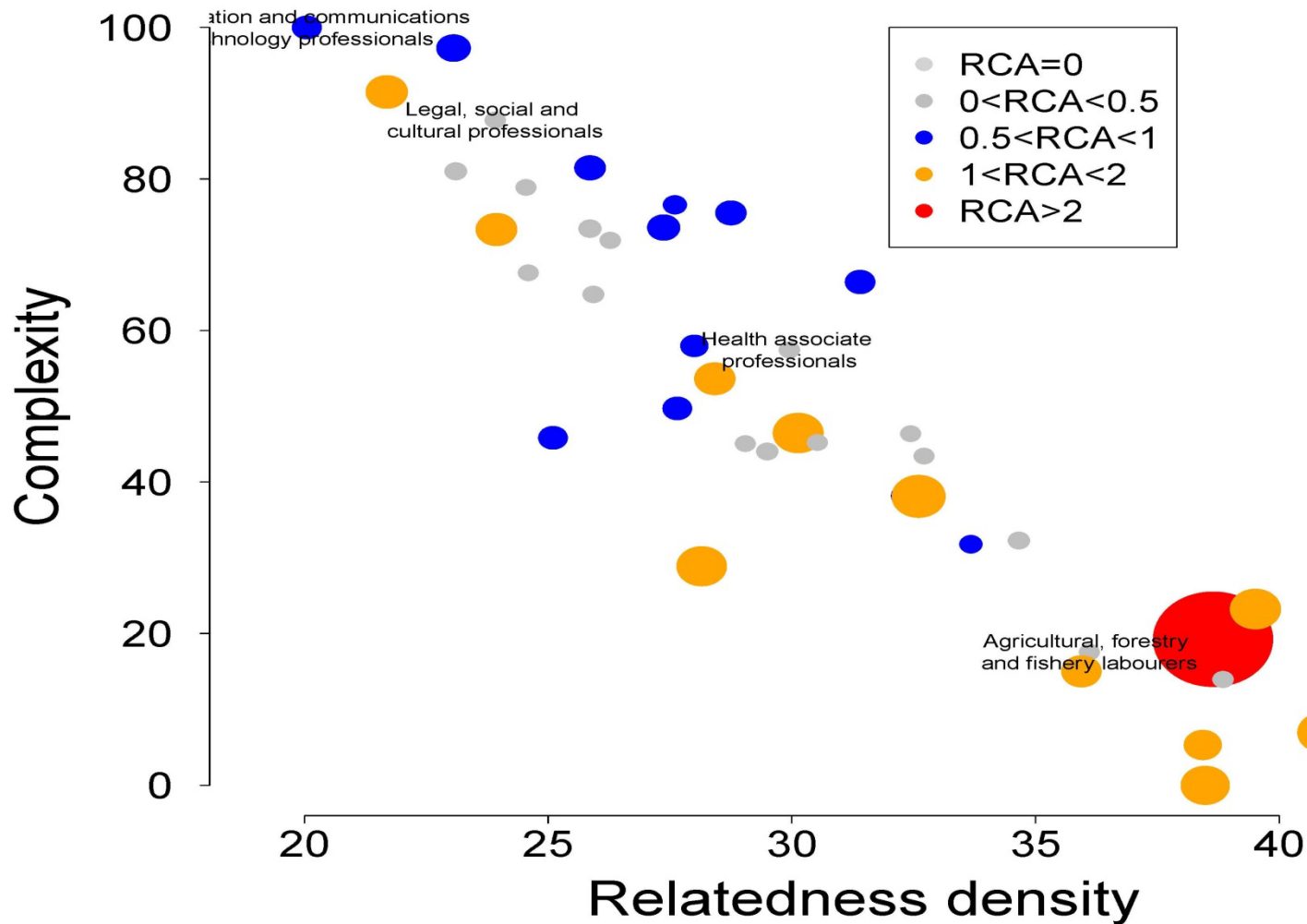
diversification opportunities in sectors

Île-de-France (FR10)



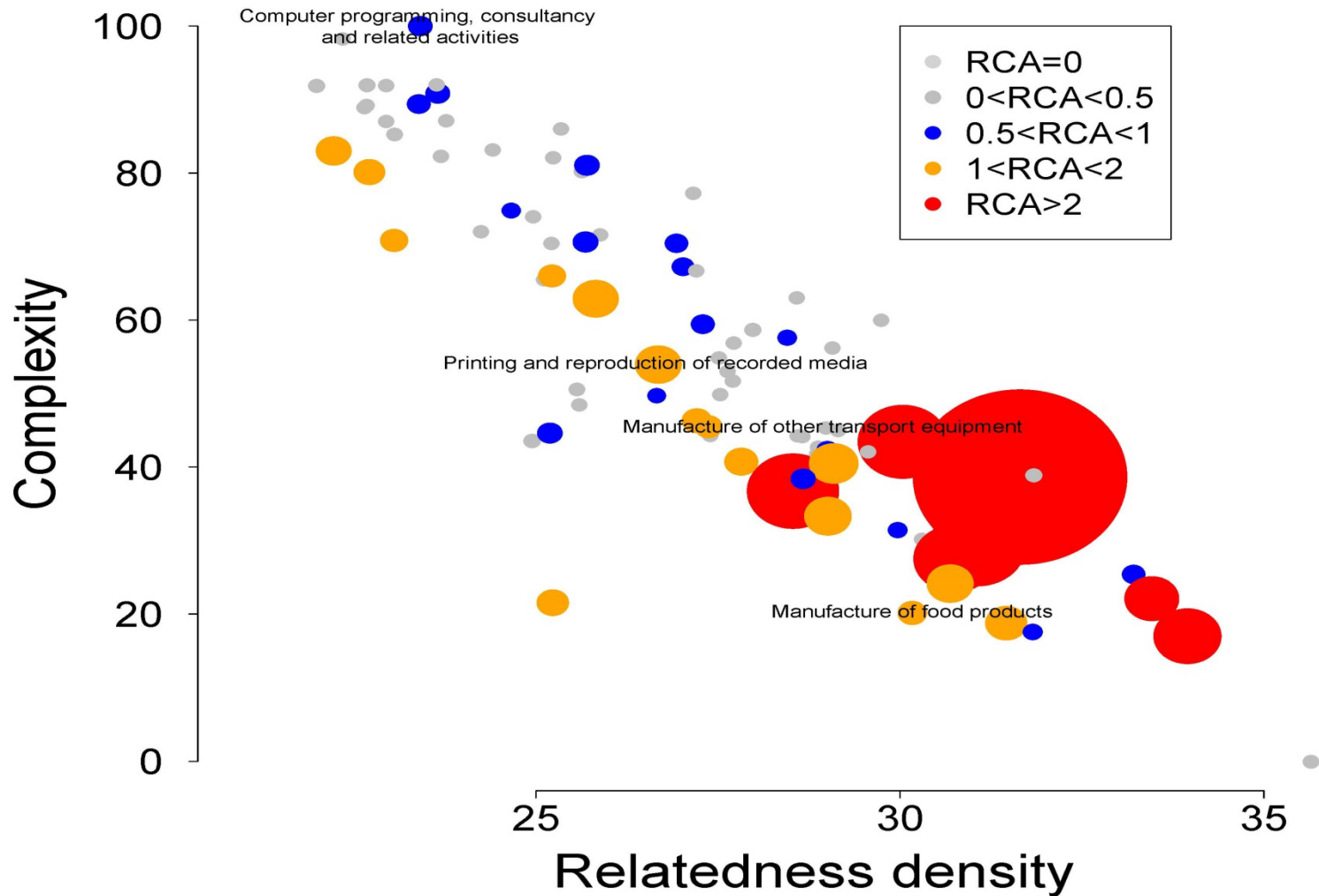
diversification opportunities in occupations

Silesia (PL22)



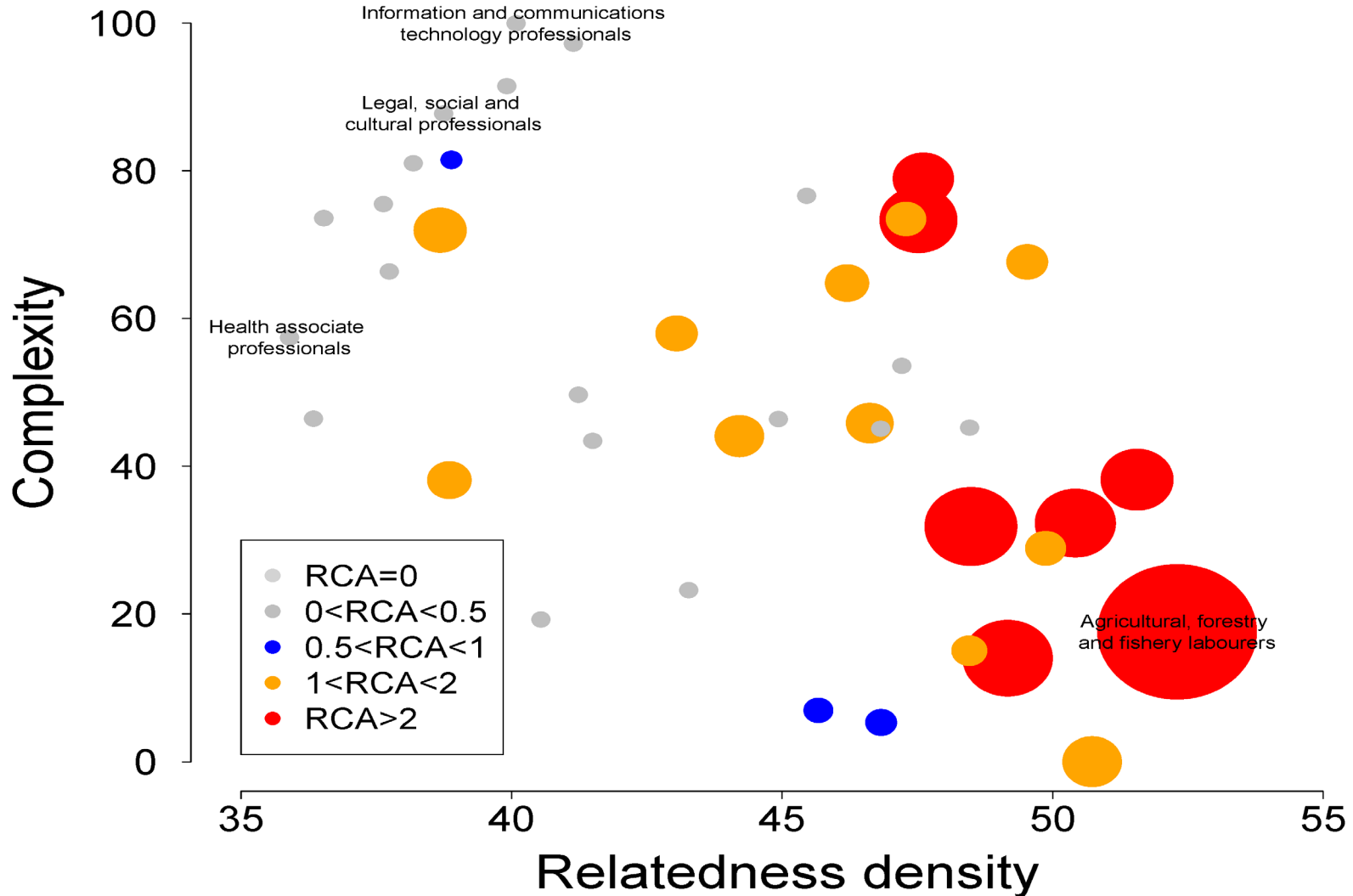
diversification opportunities in sectors

Silesia (PL22)



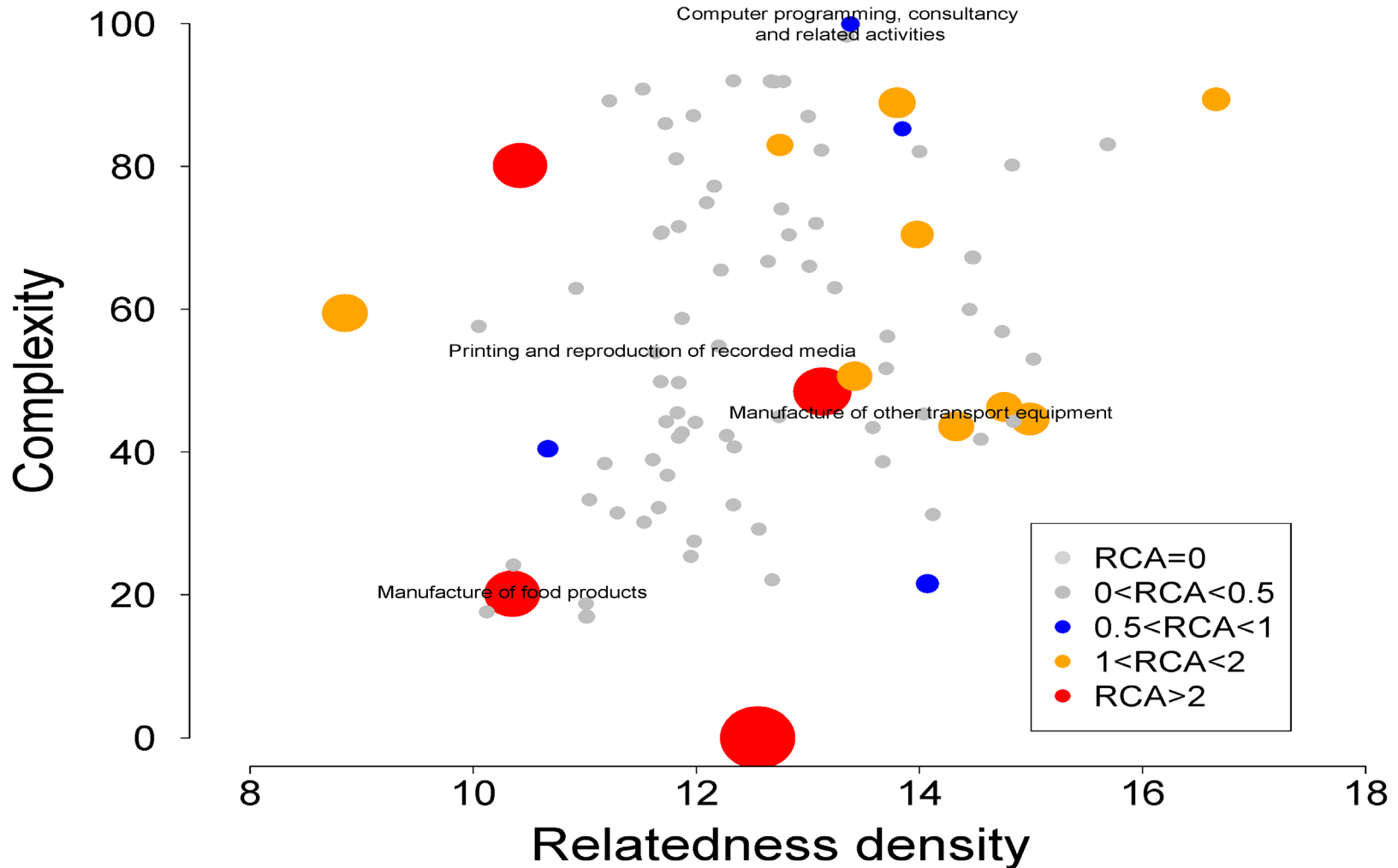
diversification opportunities in occupations

Extremadura (ES43)



diversification opportunities in sectors

Extremadura (ES43)





inter-regional linkages

- not only regional capabilities may be important, but also **inter-regional linkages**, to avoid lock-in
- can inter-regional linkages providing access to missing capabilities affect **diversification in region**?
- need for **absorptive capacity** to exploit external knowledge: non-local knowledge needs to be **related** to local knowledge (Boschma and Iammarino 2009)
- Balland, P. and R. Boschma (2021) Complementary inter-regional linkages and Smart Specialisation. An empirical study on European regions, *Regional Studies* 55 (6), 1059-1070.





inter-regional linkages

- identify **diversification opportunities of regions**:
 - based on their regional capabilities (relatedness)
 - but also on the nature of their **inter-regional linkages**
- we analyze the impact of external linkages on **technological diversification in European regions**, while controlling for regional capabilities
- we test whether **inter-regional linkages** that give access to additional capabilities in other regions that are **related to existing capabilities of regions** have a stronger impact on regional diversification



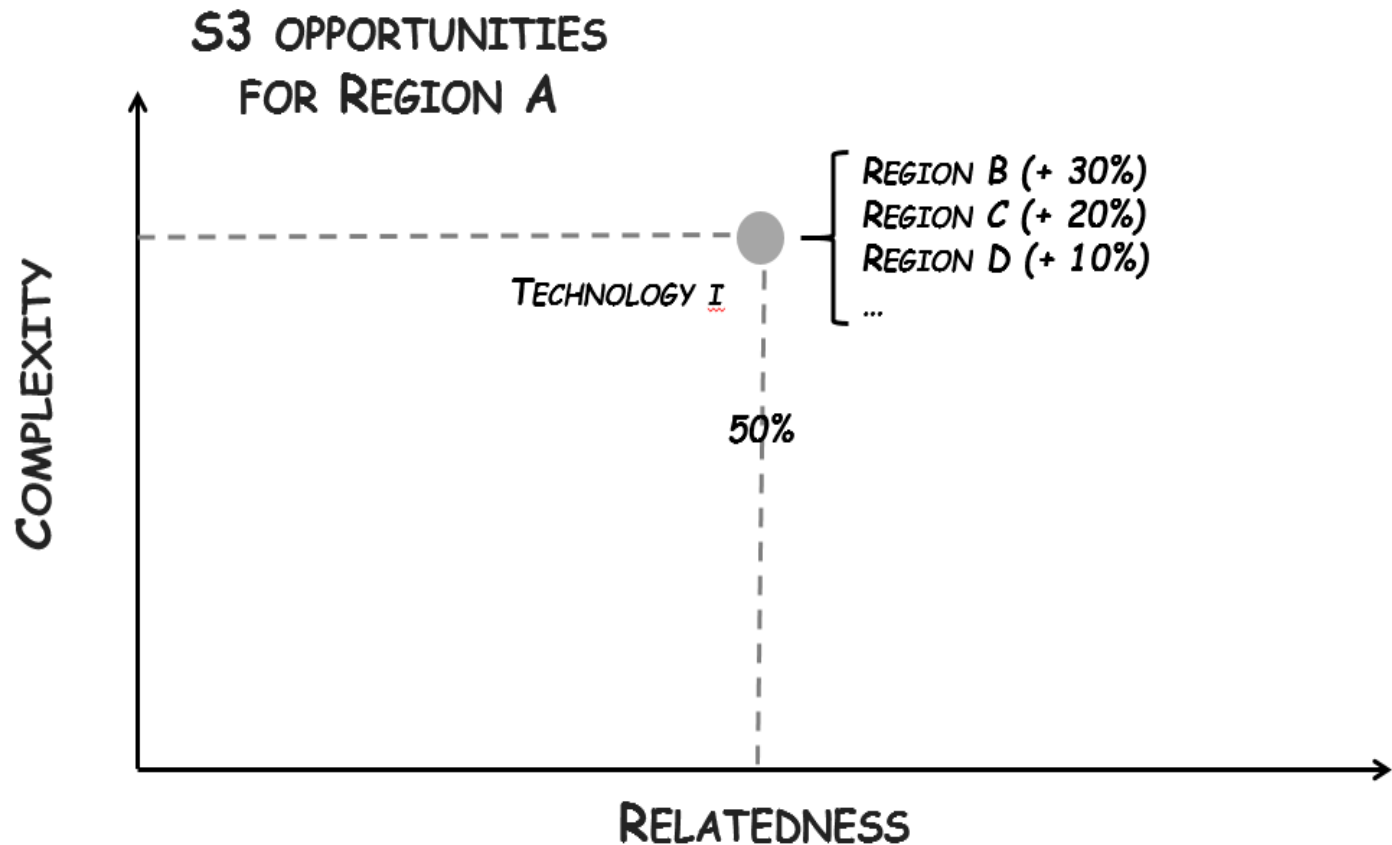


inter-regional linkages

- **regional diversification model**: patent data from the OECD REGPAT dataset: 654 technological classes (CPC) and 292 European regions (NUTS2)
- role of **regional capabilities**: relatedness density (RD)
- two measures of **inter-regional linkages**:
 - **inter-regional linkages**: number of ties with inventors in other regions (NL)
 - **complementary inter-regional linkages**: density of related non-local knowledge in which a region can tap in to diversify in a new technology (CL)



diversification opportunities of region A through complementary linkages with other regions

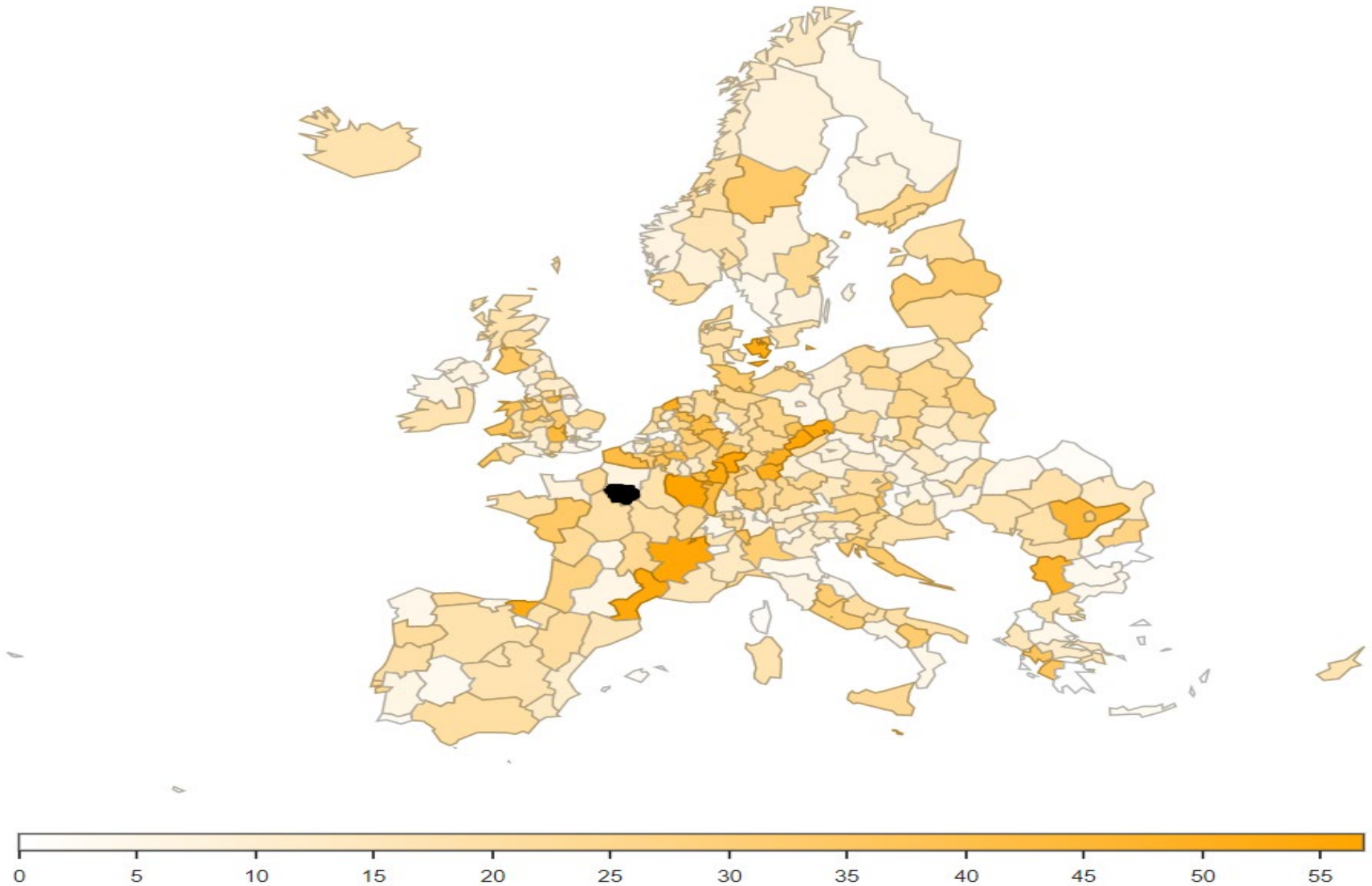


	(1)	(2)	(3)	(4)
Relatedness Density (RD)	0.003*** (0.00003)	0.003*** (0.00003)	0.004*** (0.00004)	0.002*** (0.0001)
Number of inter-regional linkages (NL)		0.005*** (0.0003)	-0.025*** (0.001)	-0.017*** (0.001)
Complementarity of inter-regional linkages (CL)			0.027*** (0.001)	0.018*** (0.001)
RD*CL				0.0002*** (0.00001)
GDP per capita	0.001*** (0.0001)	0.0001 (0.0001)	0.0002** (0.0001)	0.0001 (0.0001)
Population (log)	0.015*** (0.001)	0.010*** (0.001)	0.011*** (0.001)	0.010*** (0.001)
Period	-0.007*** (0.001)	-0.008*** (0.001)	-0.008*** (0.001)	-0.008*** (0.001)
Constant	-0.142*** (0.010)	-0.083*** (0.011)	-0.172*** (0.011)	-0.120*** (0.011)
Observations	379,876	379,876	379,876	379,876
R ²	0.037	0.038	0.044	0.044
Adjusted R ²	0.037	0.038	0.044	0.044
Residual Std. Error	0.318 (df = 379871)	0.318 (df = 379870)	0.317 (df = 379869)	0.317 (df = 379868)
F Statistic	3,658.418*** (df = 4; 379871)	2,970.927*** (df = 5; 379870)	2,885.502*** (df = 6; 379869)	2,522.347*** (df = 7; 379868)

Note:

* p** p*** p<0.01

map of complementarity of all European regions to Île-de-France region in new hydrogen technologies





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thank you for your attention!



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