



Polarization in the 16th cent.

Ideological groups during the Reformation

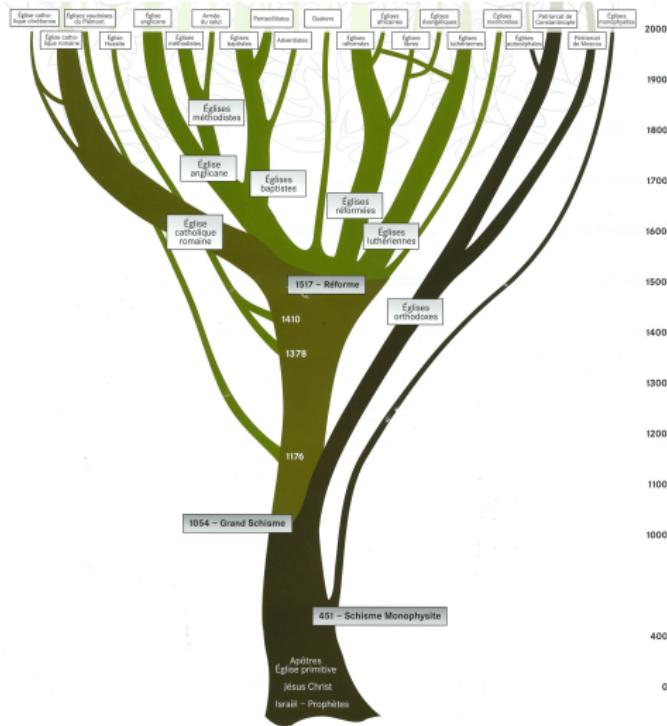
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Ideological groups during the Reformation

- ▶ **Reformation**
 - ▶ Europe, 16th century
 - ▶ Overthrew Catholic Church
 - ▶ Not only Catholicism vs. Protestantism

ideological groups = Christian denominations



source: International Museum of the Reformation, Geneva [10]

- ⌚ Aim of today: Why are ideological groups important and how can we identify them?

Ideological groups from then still matter today

Historical origins of...

- ▶ **30 (80) Years War**
 - ▶ Longest war in European History
- ▶ **National identity**
 - ▶ Lutheranism in West Germany (Martin Luther)
 - ▶ Swarmers in East Germany (Thomas Müntzer)
- ▶ **Formation of modern state**
 - ▶ Religion separates Swiss Kantons (e.g. Appenzell, Basel)
 - ▶ Theory of confessionalisation Reinhard [15] and Schilling [18]



source: Wikimedia

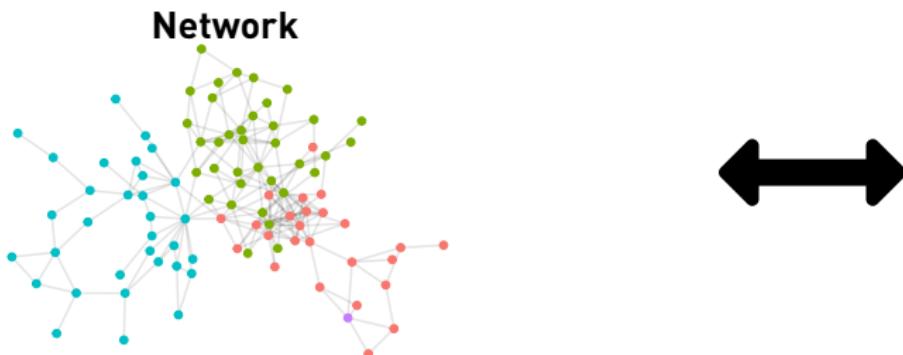


source: suche-briefmarken.de

➊ Ideological groups affect modern day decisions and identities

How to identify ideological groups?

- ▶ Letter correspondence network of reformers ⇒ **community detection**
- ▶ **Community:** group of nodes having higher *probability of being connected* to each other than to members of other groups.
- ▶ **Problem:** Several algorithms, which one to choose?
- ▶ **Infomap:** 89 communities
- ▶ **Label propagation:** 1093 communities
- ▶ **Modularity maximisation:** 15 communities



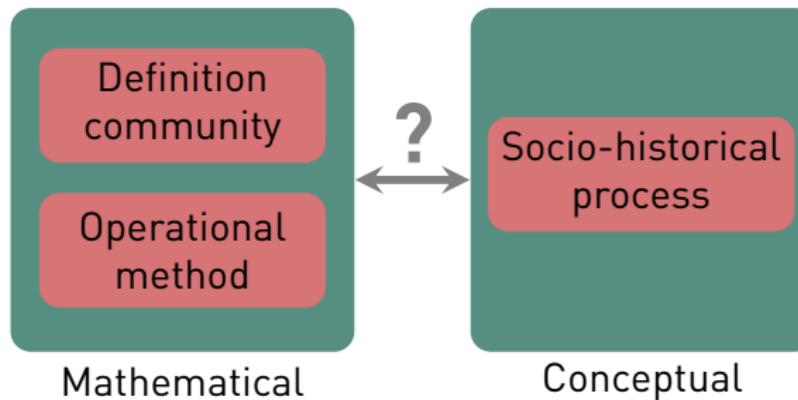
Reformation

- ▶ Lutherans
- ▶ Reformed
- ▶ Calvinists
- ▶ Baptists
- ▶ ...

⊕ Different community detection algorithms yield different partitions

Why do community detection algorithms yield different results?

- ▶ Because they define a community in different ways Coscia et al. [3] and Fortunato and Hric [7]
- ▶ Focus today: Infomap, label propagation, modularity maximisation

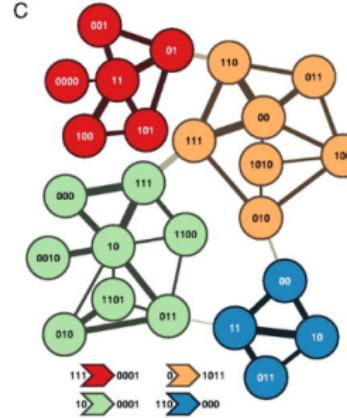
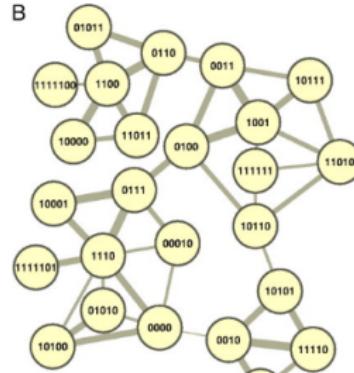
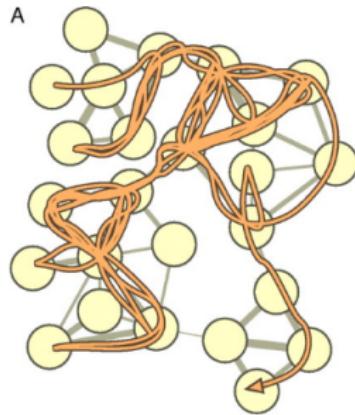


- ⌚ Map mathematical definition of algorithms to relevant socio-historical processes of the Reformation.
- ⌚ Mapping is an informed decision.

Infomap

Rosvall and Bergstrom [16]

- ▶ **Defined by closeness:** nodes can reach each other by crossing low number of edges
- ▶ **Procedure:** random walk + *compression*
- ▶ **Compression:** re-use node labels across communities, (cf. streetnames across cities)



source: Rosvall and Bergstrom [16]

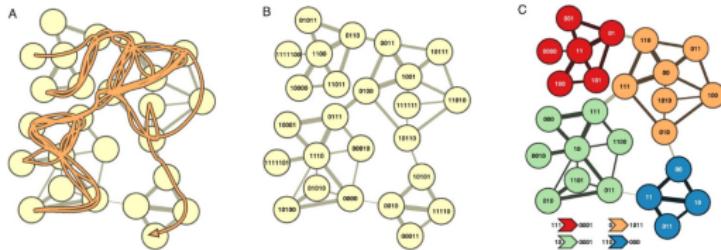
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④ Infomap: communities represent shortest compression of nodes

Map infomap to contagion

- ▶ **Contagion:** Membership when coming into contact with others who have already experienced ideas (cf. epidemic) Young [20], Bass [1], and Mahajan and Peterson [12]
- ▶ Random walk → transmission of ideas
- ▶ Compression → same idea passed on in different circumstances



- ▶ Relevant for Reformation: **Transubstantiation**
 - ▶ Change of the substance of Bread and Wine
 - ▶ **Lutherans:** Real presence of Jesus
 - ▶ **Reformed:** Symbolic and memorial character



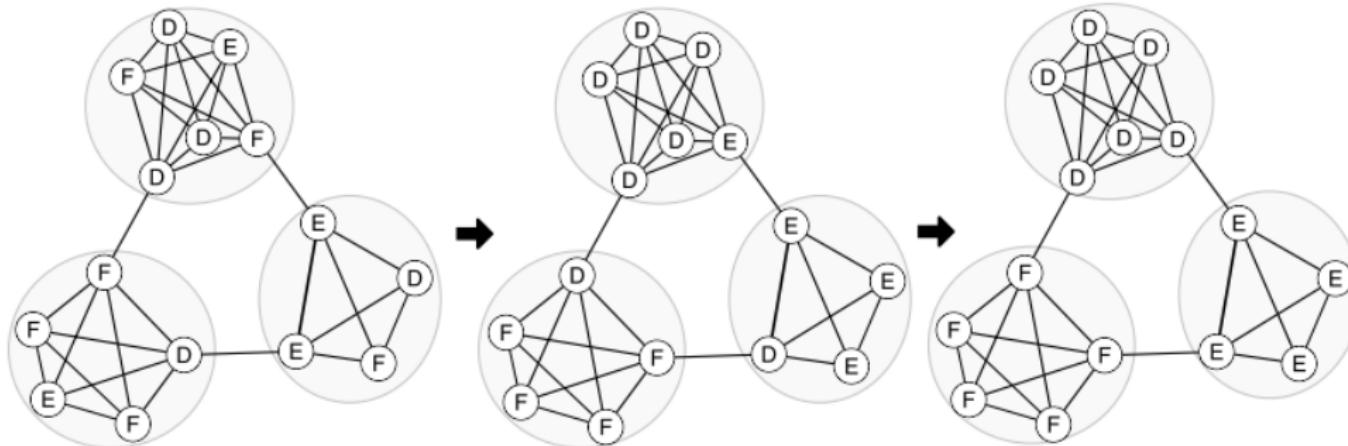
source: rnz.co.nz

- ➊ Contagion describes how idea of Transubstantiation was discussed differently among ideological groups

Label propagation

Raghavan et al. [14]

- ▶ **Defined by diffusion:** nodes grouped by propagation of same property, action or information
- ▶ **Procedure:** *transmission rule* + group by same state
- ▶ **Transmission:** node's label determined by majority of neighbours' labels

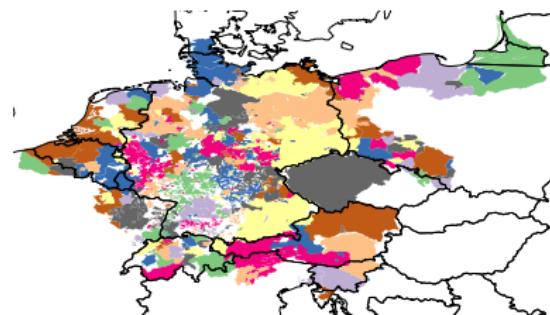


source: Coscia et al. [3]

- ⌚ **Label propagation: communities represent converged majority influence**

Map label propagation to social influence

- ▶ **Social influence:** Membership when sufficiently many others have experienced ideas (cf. conformity) Young [20], Schelling [17], Granovetter [8], Granovetter and Soong [9], and Dodds and Watts [4]
 - ▶ Transmission rule → join majority of neighbours
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- ▶ Relevant for Reformation: **Strategic alliances** Cantoni [2]
 - ▶ Adoption of Protestantism among territories
 - ▶ Weak territories adopt decision of majority of powerful neighbours

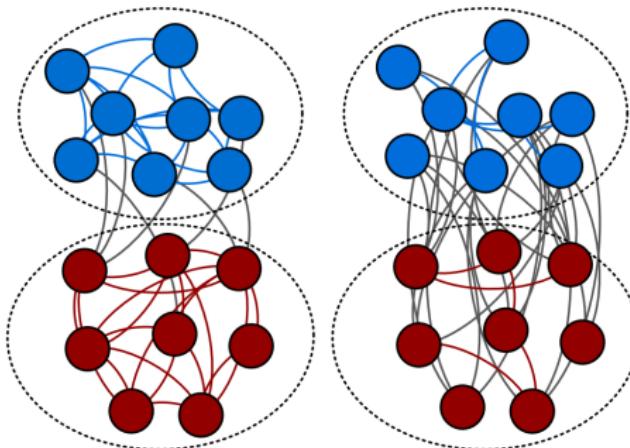


- ⌚ **Label propagation describes how majority influence reduces risk to join an ideological group**

Modularity maximisation

Newman and Girvan [13]

- ▶ **Defined by density:** nodes are more densely connected within than between communities
- ▶ **Procedure:** compare observed and random graphs in terms of intra-community density

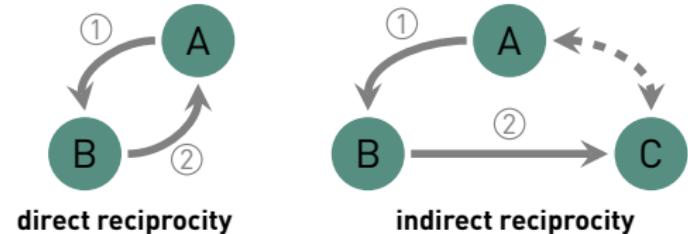


source: Fortunato and Hric [7]

- ⊕ **Modularity: communities represent densely connected nodes relative to random graph**

Map modularity to social learning

- ▶ **Social learning:** Membership once sufficient empirical evidence to convince them (cf. rational choice) Young [20], Ellison and Fudenberg [5, 6], and Kapur [11]
- ▶ Density → closed triangles (e.g. indirect reciprocity, social inference)



- ▶ Relevant for Reformation: **Indirect reciprocity**
 - ▶ Caring for widows of friends
 - ▶ Capito marries wife of Oekolampad
 - ▶ Bucer marries wife of Capito



source: Wikipedia [19]

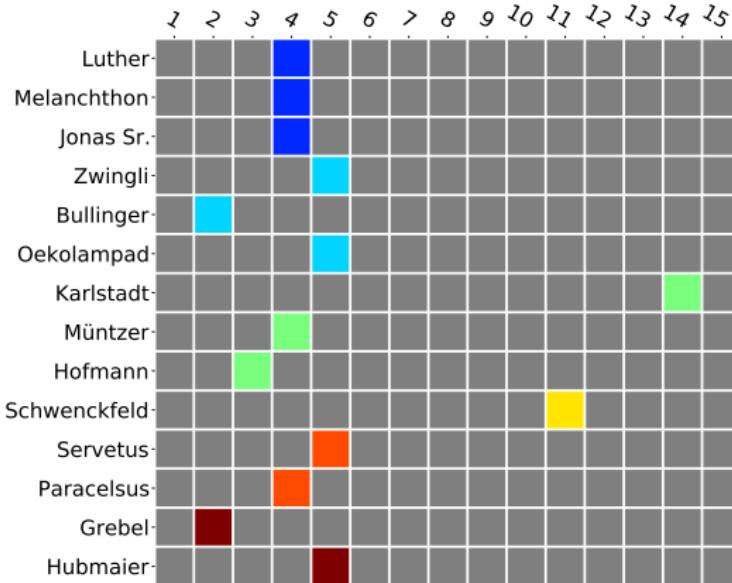
- ➊ **Modularity describes how dense connections were built via indirect reciprocity**

Which algorithm to choose?

- ▶ **Theoretical:** Process-oriented
 - ▶ Identify socio-historical process that lead to ideological groups
 - ▶ Choose algorithm which corresponds to this process

 - ▶ **Modularity:** personal encounters (social learning)
 - ▶ **Label propagation:** adoption of political decisions (social influence)
 - ▶ **Infomap:** theological doctrine (contagion)
-
- ⌚ Ideological groups mostly defined by theological differences, i.e., choose Infomap

Results Infomap



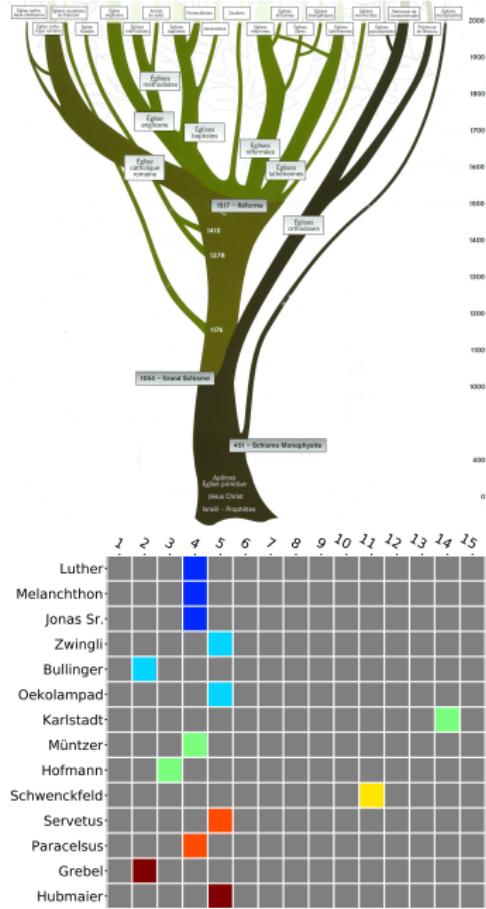
- ▶ In line with historiographical research
 - ▶ Lutherans together
 - ▶ Thomas Müntzer supporter of Luther
 - ▶ Reformed: 2 generations
- ▶ Needs further explanation
 - ▶ Distant relation between Karlstadt and Lutherans

■ Lutherans ■ Reformed ■ Schwärmer
■ Spiritualists ■ Antitrinitarians ■ Baptists

- ⌚ Success: Social processes can be mapped to community detection
- ⌚ Community detection provides starting point to explore relations in depth

Summary

- ▶ **The problem**
 - ▶ network ↔ Reformation
 - ▶ network communities ↔ ideological groups
- ▶ **The mapping**
 - ▶ **Infomap → Contagion**
 - ▶ **Label propagation → Social influence**
 - ▶ **Modularity → Social learning**
- ▶ **Results**
 - ▶ Community detection results are **interpretable**



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