

A data-driven methodology to analyze interlinkages among SDGs (and climate change)

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HLPF 2022 SIDE EVENT: Leveraging interlinkages among the SDGs to realize the 2030 Agenda

11 July 2022

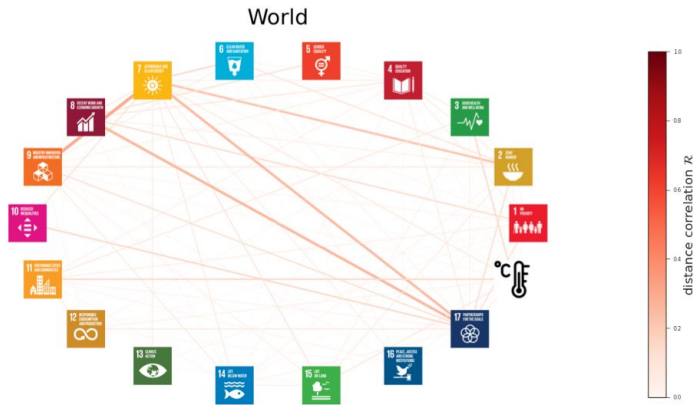
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PDF [1 MB]

Complex interlinkages, key objectives, and nexuses among the Sustainable Development Goals and climate change: a network analysis

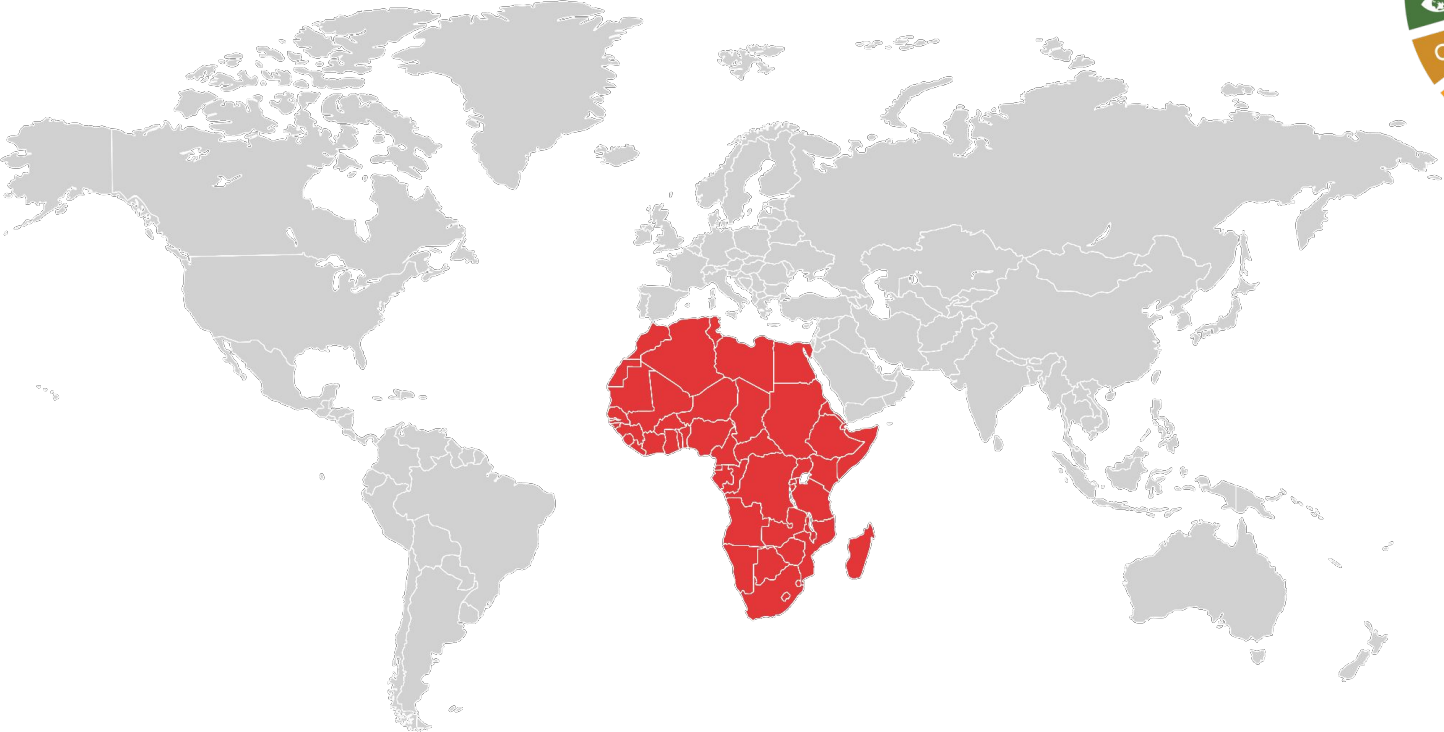
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SDGs (and climate) as a complex system of highly interconnected objectives, variables and indicators

Data

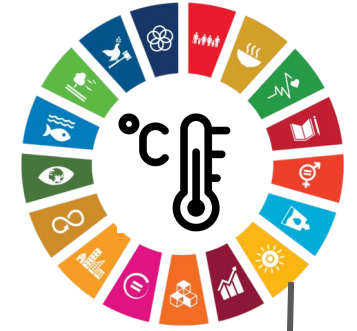


7 AFFORDABLE AND
CLEAN ENERGY

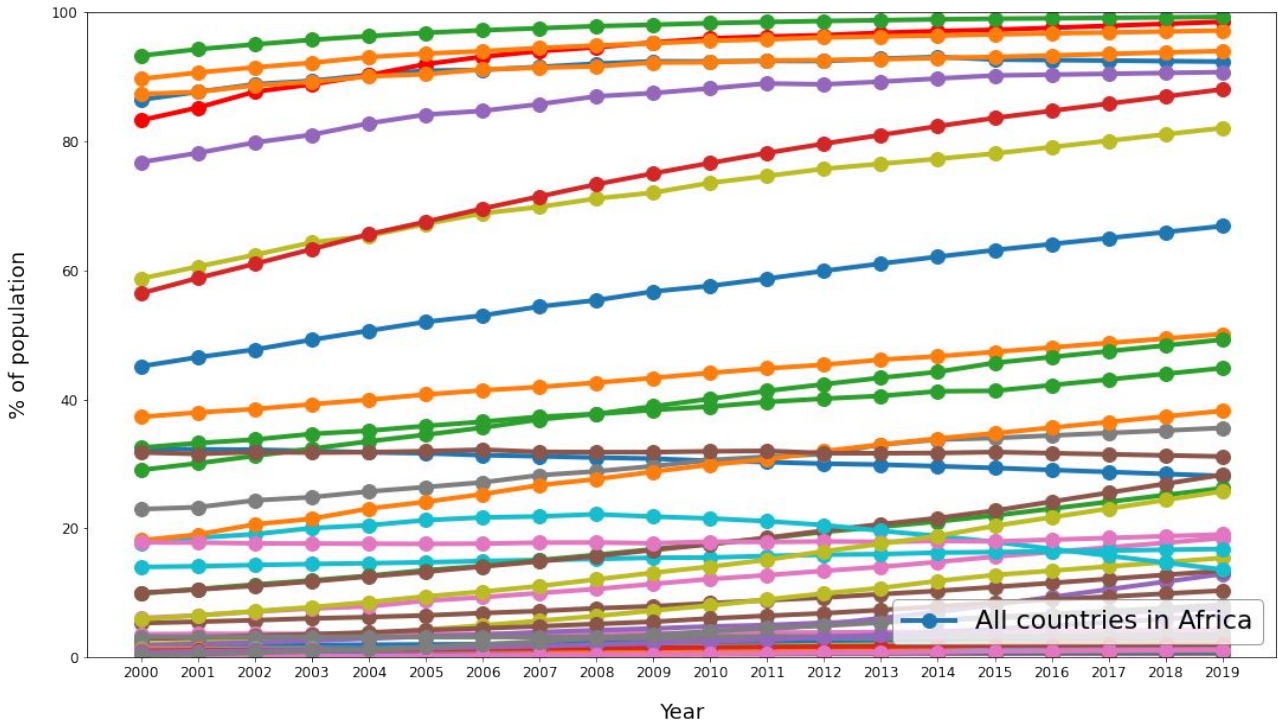


6 Indicators

- **181 countries overall** (and 35 country groupings studied)
- **400 indicators** (such as 7.1.2) over **20 years (2000-19)**

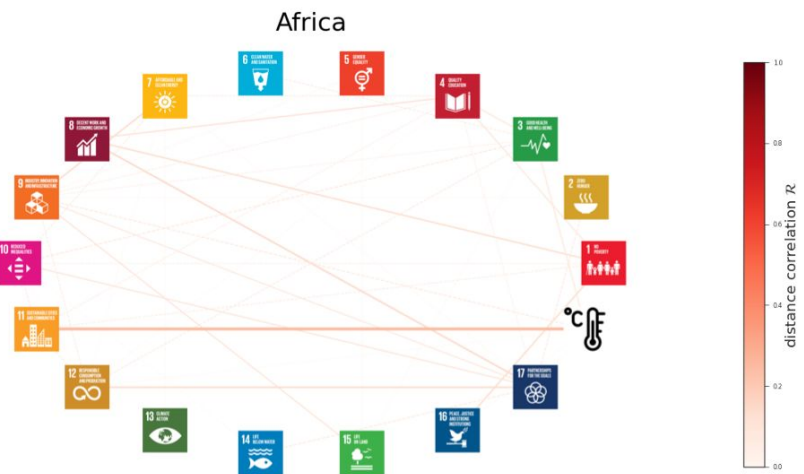
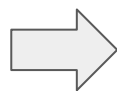
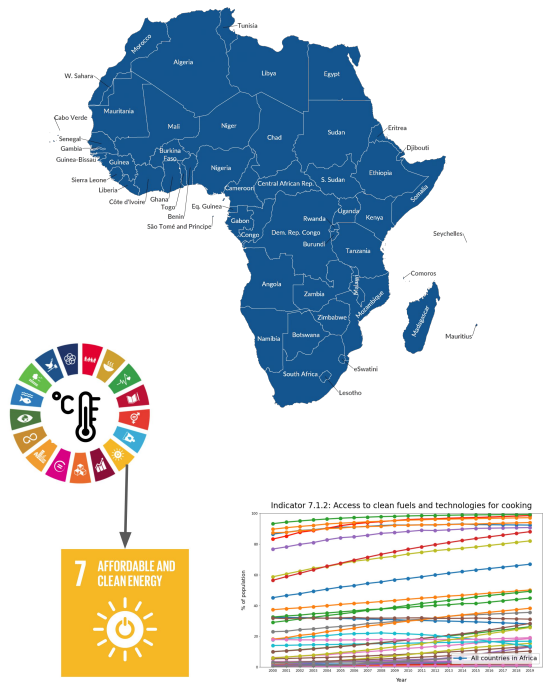


Indicator 7.1.2: Access to clean fuels and technologies for cooking



6 Indicators

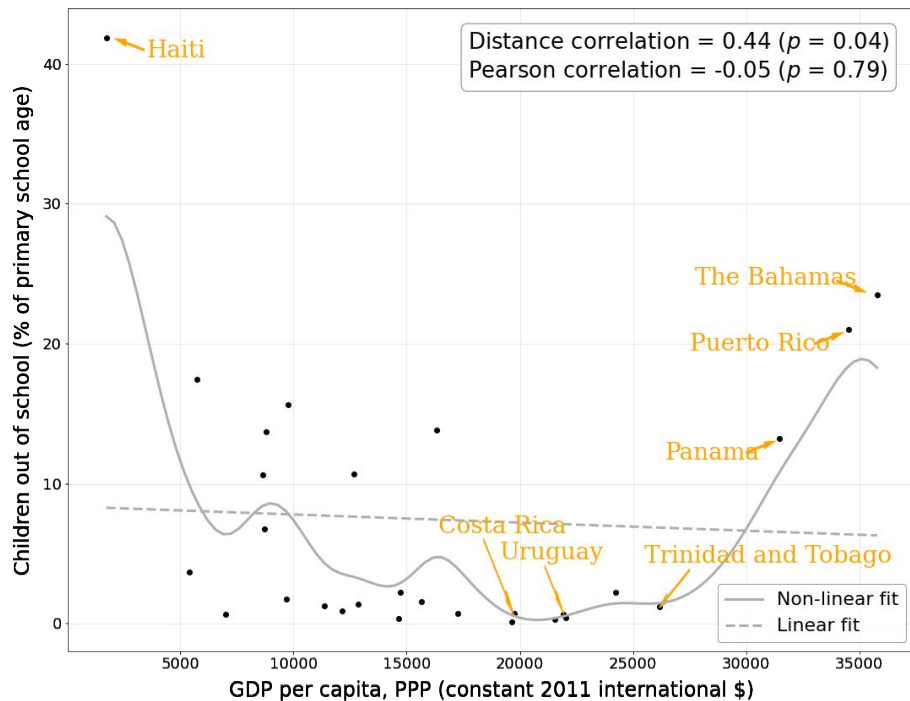
From data to a network representation



400 indicators over 20 years (2000-19)

Capturing complex relationships between indicators: **Tipping points**

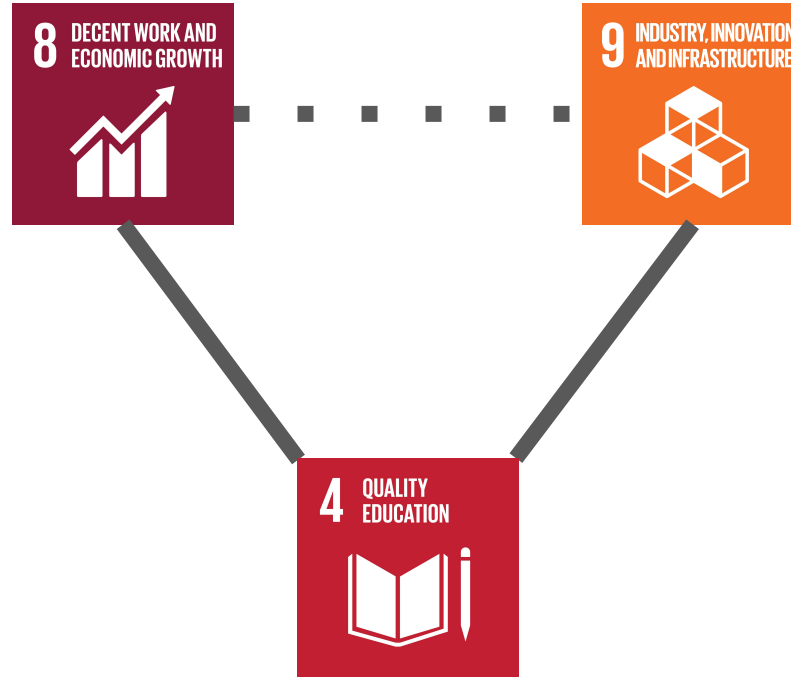
Latin America and the Caribbean



Taking away the effect of **confounders** consistently

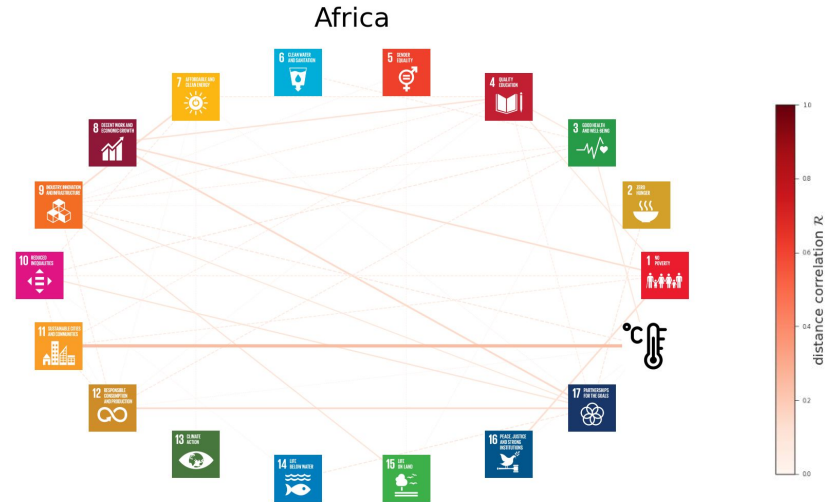
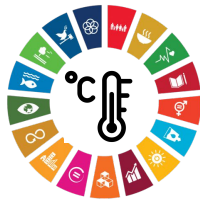
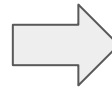
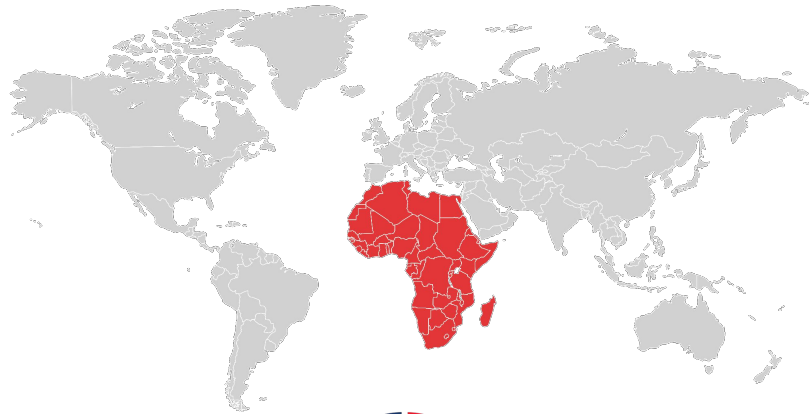
Example: Sub-Saharan Africa

Swain & Ranganathan (2021)

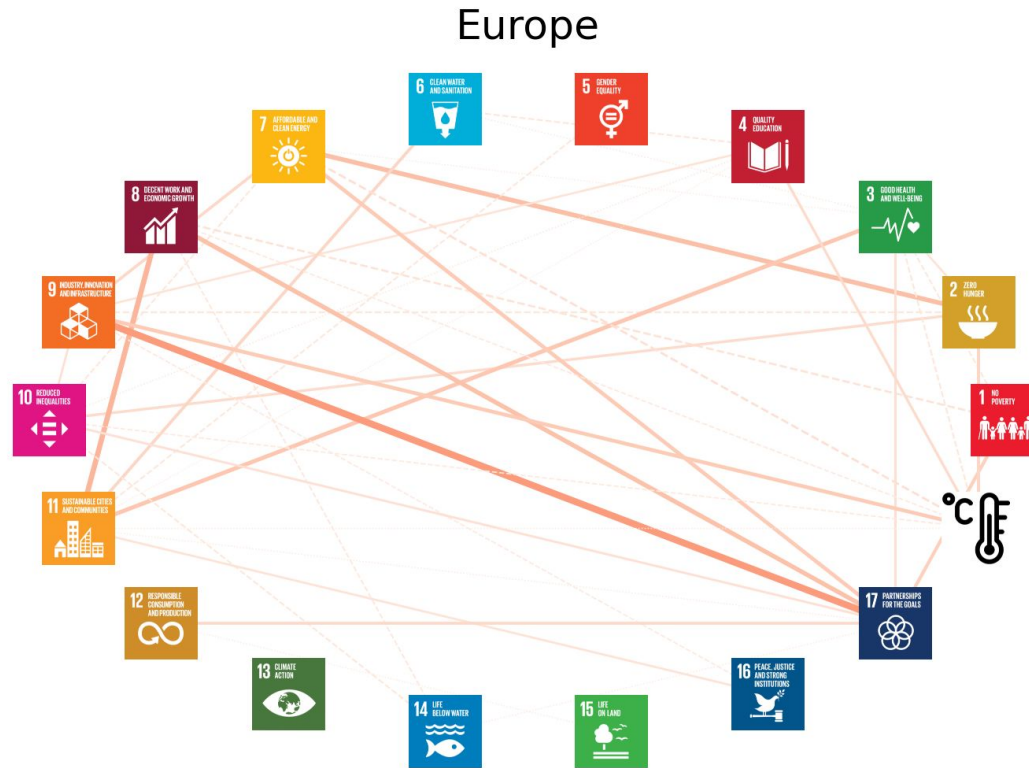


Laumann et al. (2022)

We construct networks of SDG interlinkages for 35 country groupings



We find significant **regional differences** in the structure of the interlinkages

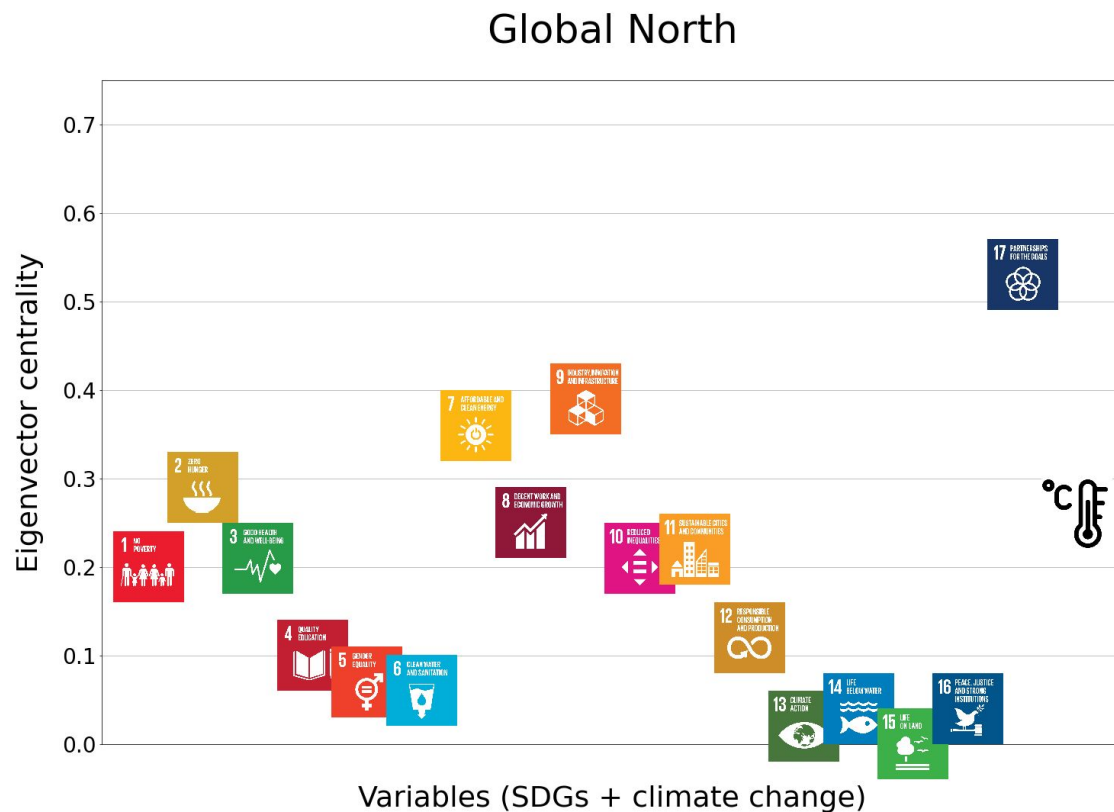


We find significant **regional differences** in the structure of the interlinkages

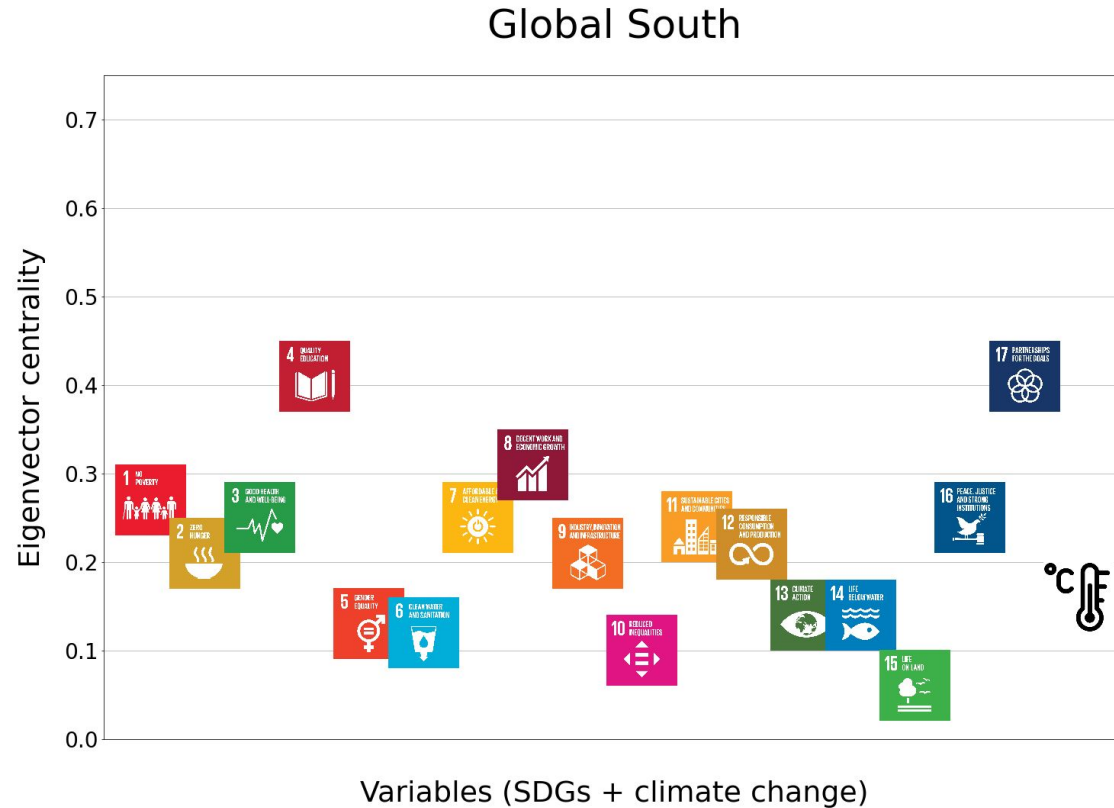
Sub-Saharan Africa



There are regional differences in the **centrality (importance)** of the SDGs



There are regional differences in the **centrality (importance)** of the SDGs



Three most central SDGs vary strongly across groupings

World	7 (0.46)	17* (0.43)	9 (0.34)
Global North	17* (0.53)	9 (0.39)	7 (0.36)
Global South	4 (0.41)	17* (0.41)	8 (0.31)
Caribbean	11* (0.71)	T* (0.64)	15 (0.30)

Three most central SDGs vary strongly across groupings

	First most central variable	Second most central variable	Third most central variable
World	7 (0-46)	17* (0-43)	9 (0-34)
Global North	17* (0-53)	9 (0-39)	7 (0-36)
Global South	4 (0-41)	17* (0-41)	8 (0-31)
Africa	17* (0-38)	T* (0-34)	9 (0-33)
Northern and Western Africa	17* (0-62)	12 (0-55)	8 (0-33)
Middle Africa	T* (0-66)	11* (0-55)	10 (0-44)
Southern and Eastern Africa	T* (0-54)	11* (0-48)	3 (0-39)
Sub-Saharan Africa	11* (0-35)	4 (0-33)	10 (0-33)
Americas	17* (0-43)	7 (0-39)	1 (0-37)
North and Central America	6 (0-66)	16 (0-55)	7 (0-43)
Caribbean	11* (0-71)	T* (0-64)	15 (0-30)
South America	11* (0-58)	12 (0-57)	3 (0-44)
Latin America and the Caribbean	17* (0-46)	1 (0-40)	11* (0-37)
Asia	17* (0-48)	8 (0-34)	7 (0-32)
Central and Eastern Asia	T* (0-58)	3 (0-56)	11* (0-43)
Southeastern Asia	11* (0-58)	17* (0-56)	T* (0-41)
Southern Asia	3 (0-60)	T* (0-57)	2 (0-42)
Western Asia	T* (0-58)	12 (0-41)	1 (0-39)

Europe	17* (0-47)	9 (0-42)	7 (0-35)
Northern Europe	11* (0-68)	10 (0-39)	17* (0-37)
Eastern Europe	17* (0-71)	9 (0-56)	T* (0-43)
Southern Europe	7 (0-64)	5 (0-35)	4 (0-33)
Western Europe	T* (0-71)	13 (0-71)	(all others)
Oceania	1 (0-57)	7 (0-57)	9 (0-36)
Oceania (excluding Australia and New Zealand)	2 (0-71)	1 (0-59)	13 (0-39)
High Income	17* (0-47)	7 (0-43)	9 (0-38)
Upper-Middle Income	T* (0-45)	17* (0-41)	8 (0-30)
Lower-Middle Income	11* (0-41)	17* (0-38)	T* (0-36)
Low Income	17* (0-55)	12 (0-40)	9 (0-33)
Least Developed Countries	8 (0-48)	4 (0-46)	1 (0-43)
Land-locked Developing Countries	3 (0-53)	T* (0-42)	11* (0-38)
Small Island Developing States	8 (0-48)	17* (0-42)	4 (0-35)
G20	7 (0-48)	17* (0-40)	2 (0-36)
Emerging Markets†	16 (0-70)	3 (0-52)	6 (0-31)
OPEC	1 (0-52)	17* (0-51)	4 (0-44)

Three most central SDGs vary strongly across groupings



Overall, 17, 11, T appear most amongst the top three variables

How does the network representation help us understand particular aspects of interlinkages?

Data driven approach: integrates many factors but these need to be interpreted through expert analysis to lead to policy

- Causal inference is our current research focus (currently our work only highlights complex associations) but even then it is only an indication for in-depth work by experts

Regional differences necessitate diverse approaches: expertise adapted to local knowledge is crucial (given the differences observed)

- It is key to have data collection, curation and interpretation across the world

Method can be used to examine the effect of scenarios where certain associations are weakened or strengthened

- This can be done at the level of target or indicators, which are more connected to policy decisions, prioritisation of resources, and evaluation of cost and technologies targeted at particular outcomes

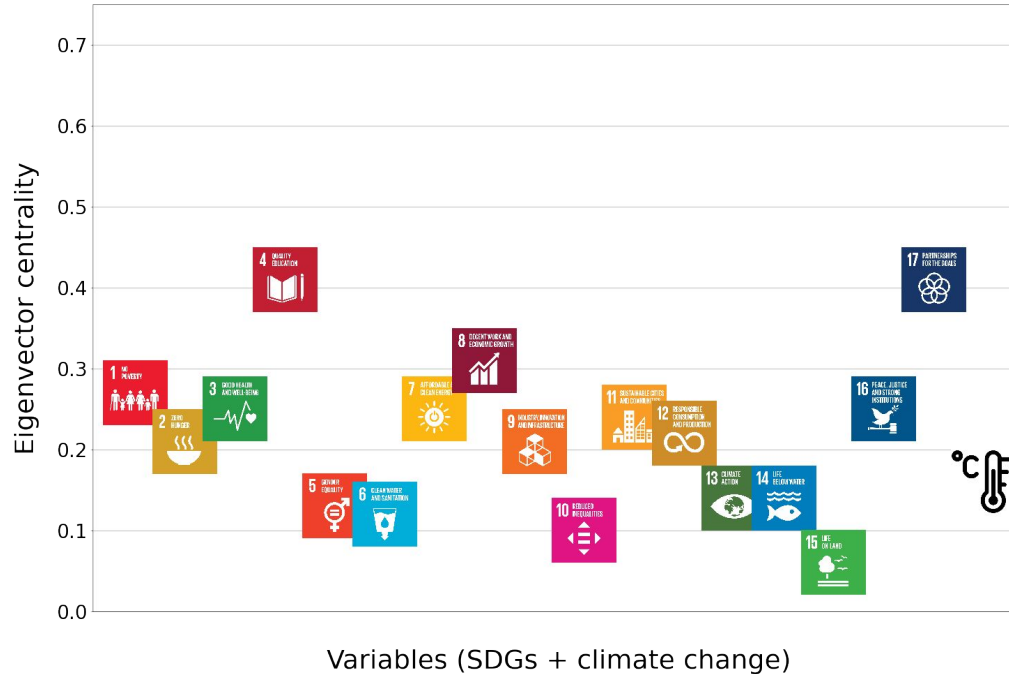
Scenario modelling: **removing edge 8 – 17**

Global South



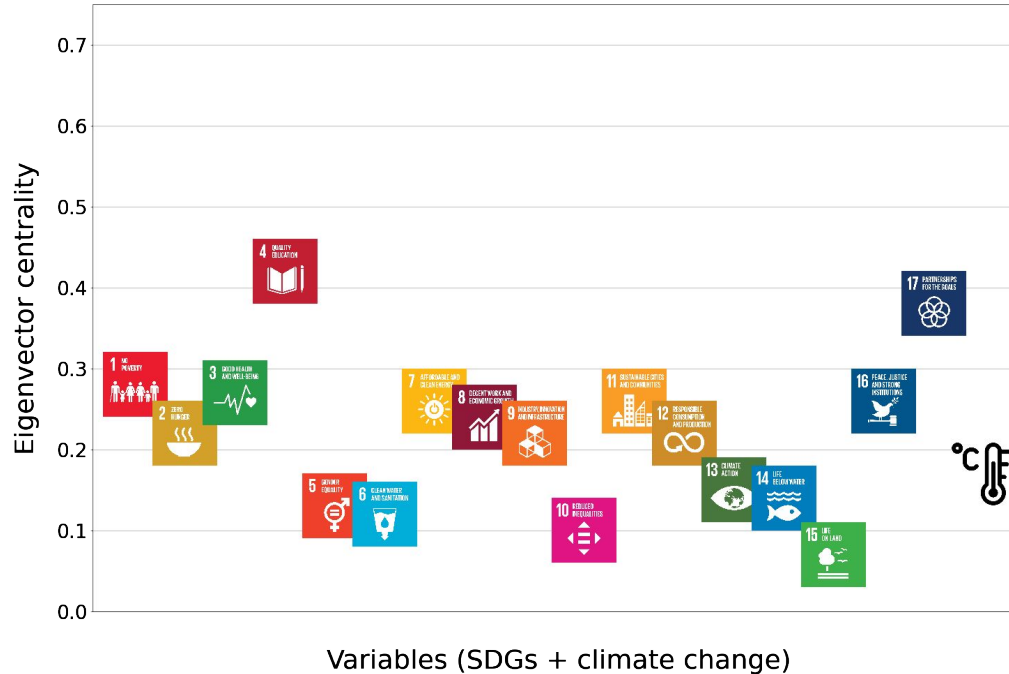
Scenario modelling: removing edge 8 – 17

Global South



Scenario modelling: removing edge 8 – 17

Global South



Thank you

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Code available:

<https://github.com/felix-laumann/SDG-networks>

Appendix: Nexuses

Sub-Saharan Africa

