
Visa Requirements Network

Get outta here with ease.

Group 13

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Motivation

- Comprehensive visa information at a glance
 - Compare across different countries their visa requirements and capture underlying relations
 - Identify countries with different levels of openness
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Data Source

Project Visa
www.projectvisa.com

Visa information for all countries.

Countrypname	Region
Afghanistan	Asia
Albania	Europe
Algeria	Africa
American Samoa	Australasia
Andorra	Europe
Angola	Africa
Anguilla	Caribbean
Antigua and Barbuda	Caribbean
Argentina	South America
Armenia	Europe

Visa Information for Australia

Visa Information

All travelers to Australia, other than Australian and New Zealand citizens, are required to hold a valid visa to travel to Australia.

Visitors from Andorra, Austria, Belgium, Brunei, Canada, Denmark, Finland, France, Germany, Greece, Hong Kong, Iceland, Ireland, Italy, Japan, Liechtenstein, Luxembourg, Malaysia, Malta, Monaco, Norway, Netherlands, Portugal, San Marino, Singapore, South Korea, Spain, Sweden, Switzerland, Taiwan, United Kingdom, USA and Vatican City can apply for an ETA that allows you to visit for up to 3 months per visit in a 12 month period. The visa is free but you need to pay a service fee (A\$20) to apply.

Different Levels of Visa Curtailment

Exemption

Free Visa

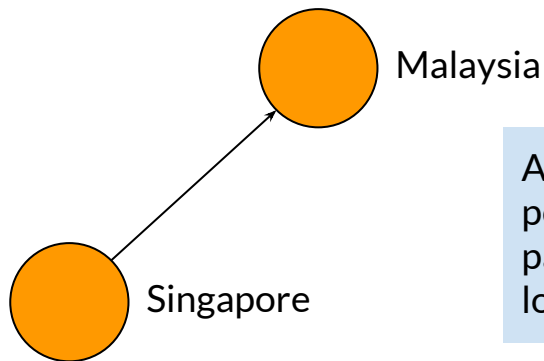
Visa on Arrival

Different
Length

Different Cost

Network Generation

- Create a full list of countries as nodes;
- Create edges if there is easy visa requirement relation between two countries.



An edge is created from Singapore pointing to Malaysia if Singapore passport holder can visit Malaysia with loosened visa requirements.

[] do not need a visa

Only [] need a visa

[A] need a visa,
[B] do not

[EU] do not need a visa

Same as A

Parsing Methods

Create edges with all the countries in []

Create edges with all the countries except the ones in []

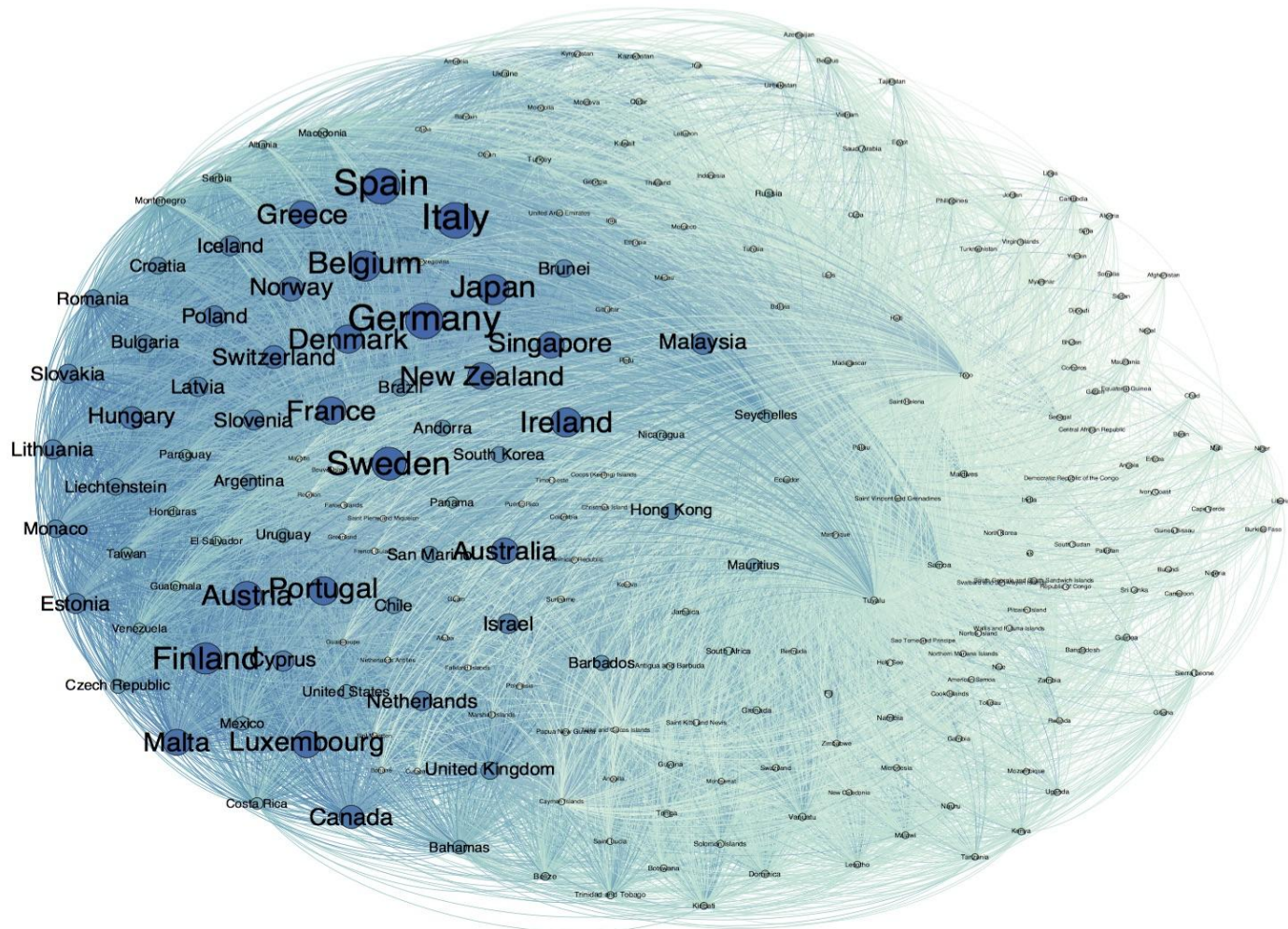
Create edges only with the countries in [A]

Create edges with countries in the predefined EU list

Replicate the in-neighbors of node A



Our Network



Basic Parameters

Singapore

<i>in-degree</i>
69
<i>out-degree</i>
154

Type

directed
unweighted

Vertices

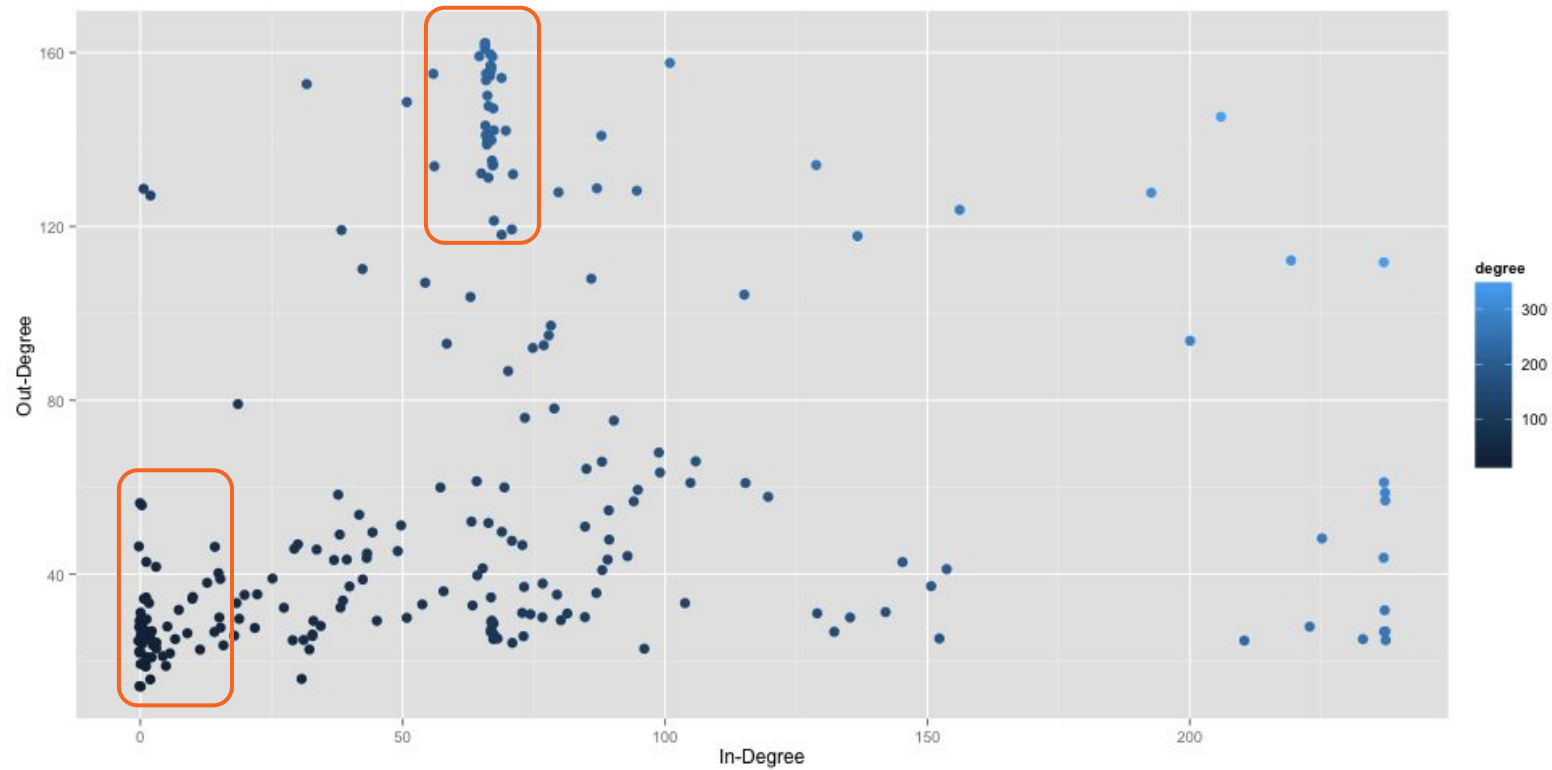
238

Edges

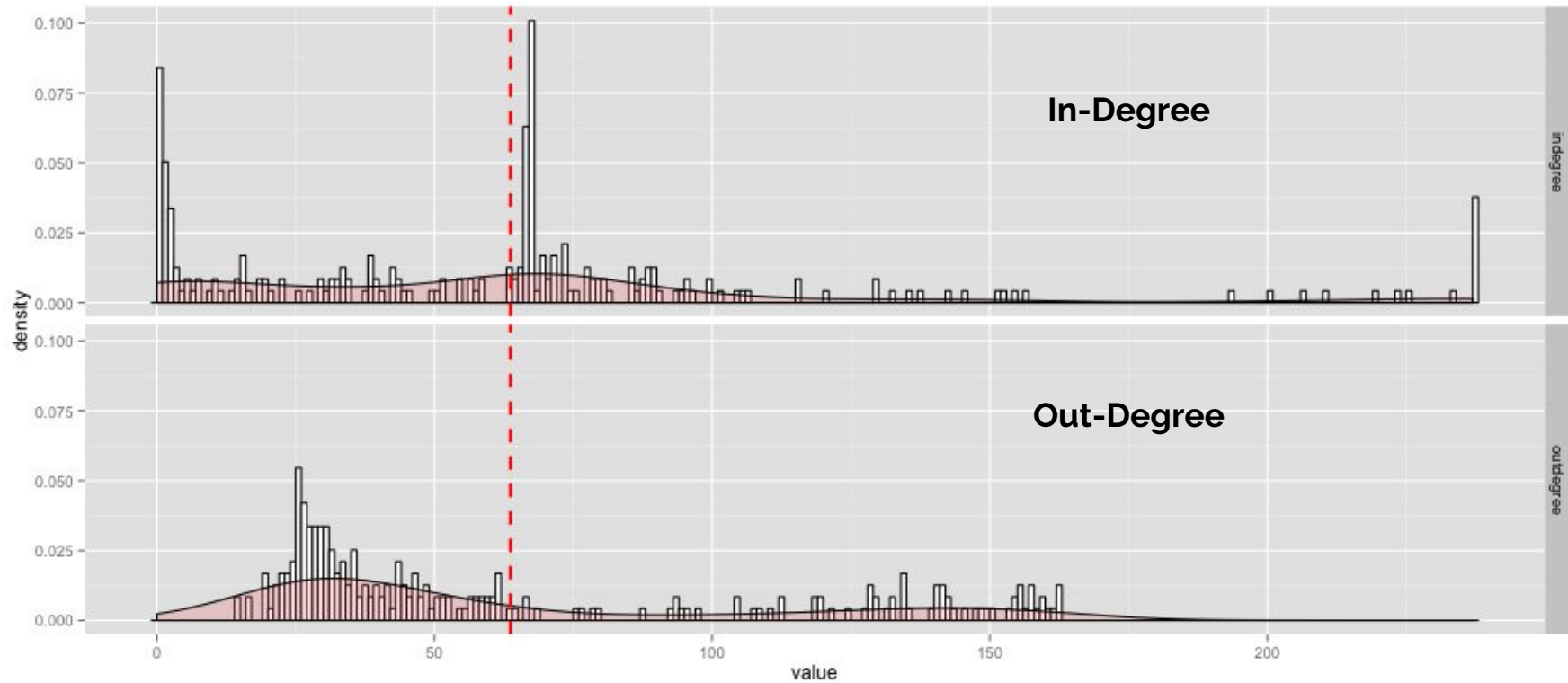
15156

Mean Degree

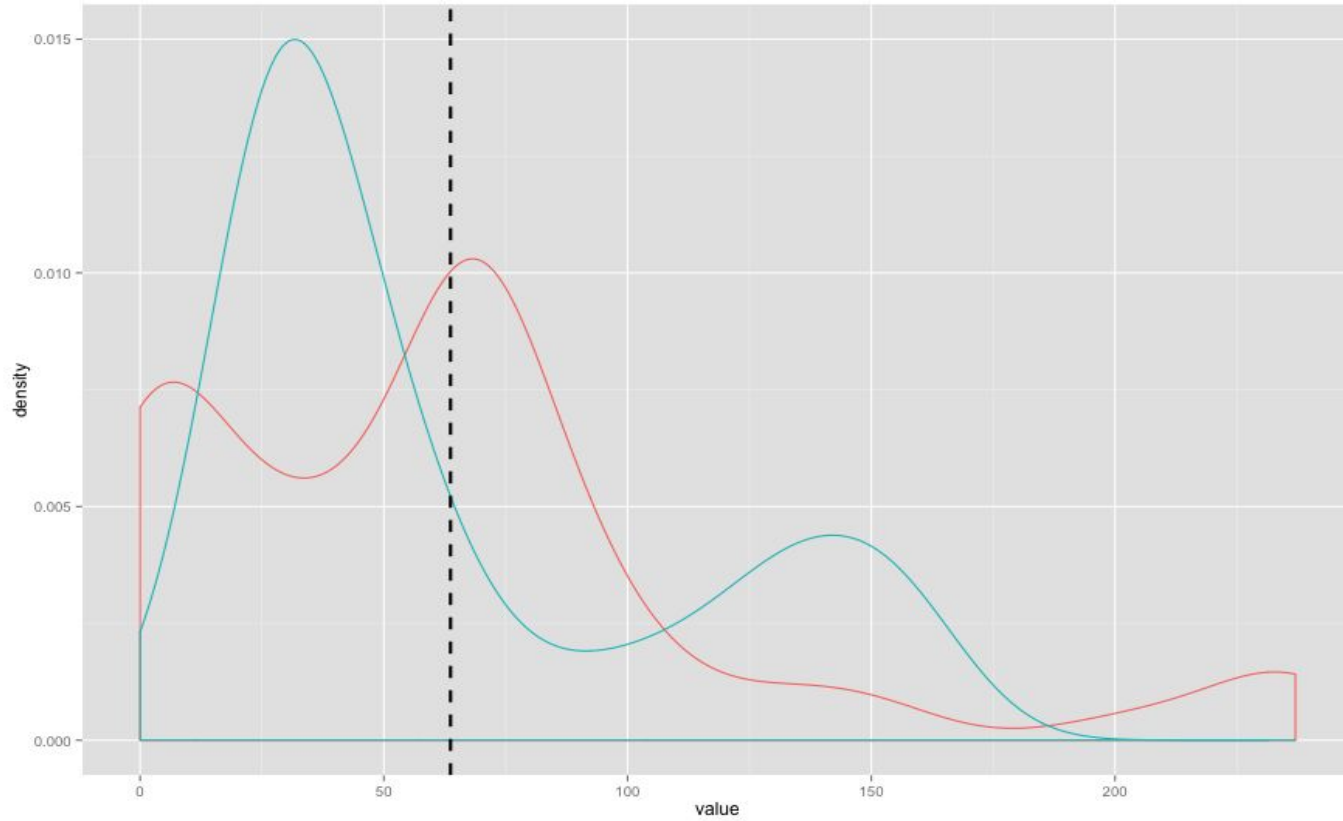
63



Degree Distribution



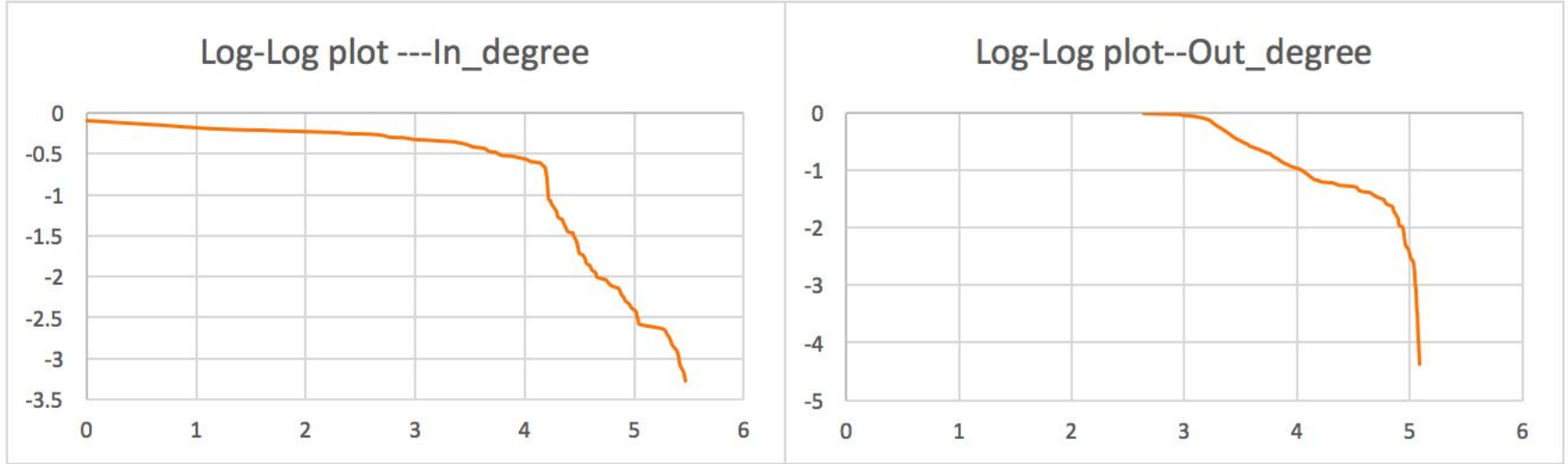
Degree Distribution



In-Degree
Out-Degree

Degree Distribution

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Degree Distribution - Power Law

Structure and Components

49%



Largest K-Core: 86-Core

91%

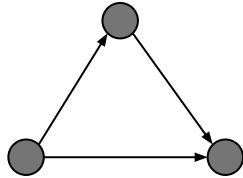


Largest Strongly-connected
Component

Transitivity

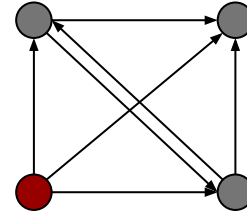
54%

Global Clustering
Coefficient

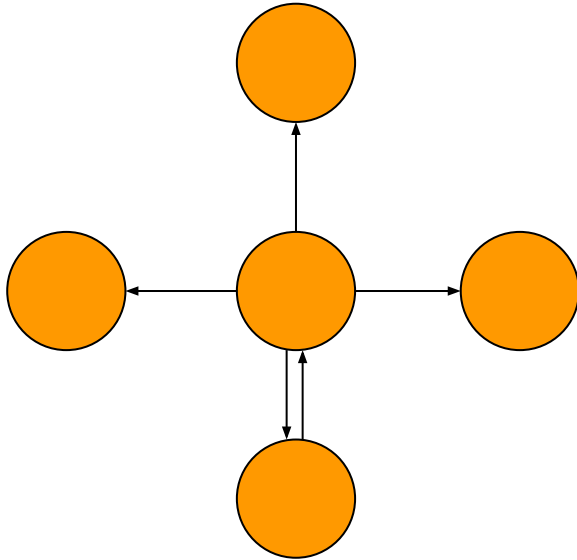


67%

Network Average
Clustering Coefficient



Reciprocity



Reciprocity of this network is 0.4339



Countries that are reciprocal with
Singapore

Cocitation & Bibliographic Coupling

Interpretations

Most archipelago nations have the same degree of opening to the whole world . Their tourism industry might be a leading factor.

Cocitation

Madagascar	236	Maldives
Madagascar	236	Palau
Madagascar	236	Saint Helena
Madagascar	236	Saint Vincent and Grenadines
Madagascar	236	Samoa

Cocitation & Bibliographic Coupling

Interpretations

Many Europe countries are acknowledged internationally to a similar extent. Some countries are open to the entire EU.

Bibliography

Finland	159	Germany
Germany	159	Italy
Germany	159	Spain
Germany	159	Sweden
Italy	159	Spain

Cocitation & Bibliographic Coupling

<i>Cocitation</i>		<i>Bibliography</i>	
Singapore	Ecuador	Singapore	Finland
Singapore	Laos	Singapore	Germany
Singapore	Madagascar	Singapore	Italy
Singapore	Maldives	Singapore	Spain
Singapore	Martinique	Singapore	Sweden

Interpretations

Because our network has a very large mean degree, the results of these couplings can be sometimes trivial and subject to countries with highest degrees.

Centrality

Centrality Methods	Degree (Out)	Eigenvector (Left)	Katz (Left)	PageRank (Left)
1.	Germany	Italy	Italy	Italy
2.	Italy	Spain	Spain	Spain
3.	Spain	Germany	Germany	France
4.	Sweden	Sweden	Sweden	New Zealand
5.	Finland	Finland	Finland	Norway

Centrality

What are the *most powerful* passports

Method

PageRank

Left
Eigenvector

Out-neighbors

Descending

1. Italy (27.6948)	6. Norway (15.5794)
2. Spain (20.4539)	7. Australia (15.2893)
3. France (19.7658)	8. Switzerland (14.8847)
4. New Zealand (17.2965)	9. Germany (14.8063)
5. Israel (16.9520)	10. Sweden (14.6957)



Centrality

What are the *least powerful* passports

Method

PageRank

Left
Eigenvector

Out-neighbors

Ascending

1. Somalia (1.2246)	6. Democratic Republic of the Congo (1.4623)
2. Ethiopia (1.2627)	7. South Sudan (1.4743)
3. Eritrea (1.3294)	8. Comoros (1.5438)
4. Djibouti (1.3432)	9. Lebanon (1.5469)
5. Afghanistan (1.3636)	10. Timor-Leste (1.5668)



Centrality

What are the countries that *everyone* can visit

Method

PageRank

Right
Eigenvector

In-neighbors

Descending

Maldives	Madagascar
Palau	Samoa
Saint Helena	Seychelles
Saint Vincent and Grenadines	Tuvalu
Togo	Haiti



Centrality

Which countries are the *hardest* to visit

Method

PageRank

Left
Eigenvector

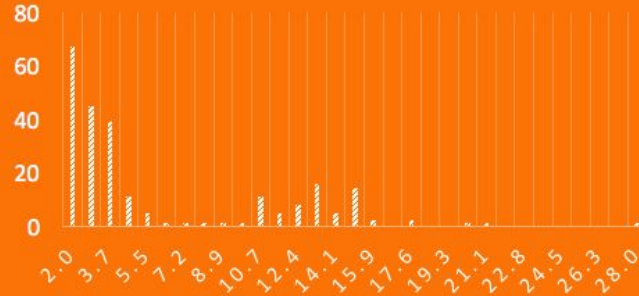
Out-neighbors

Ascending

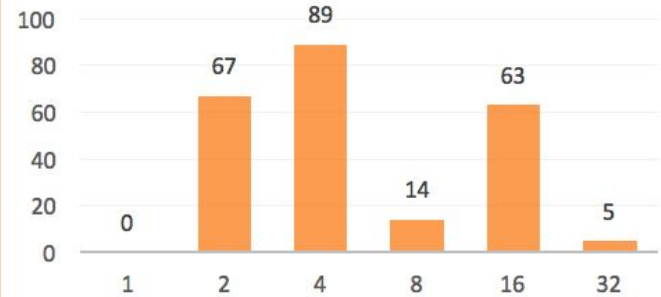
Guinea	Comoros
Gabon	Democratic Republic of the Congo
Afghanistan	Djibouti
American Samoa	North Korea
Benin	Libya

Power Law?

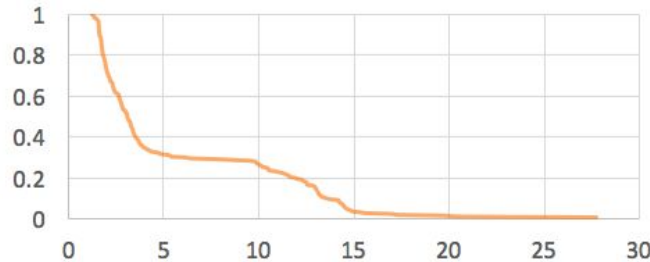
PAGE RANK CENTRALITY DISTRIBUTION



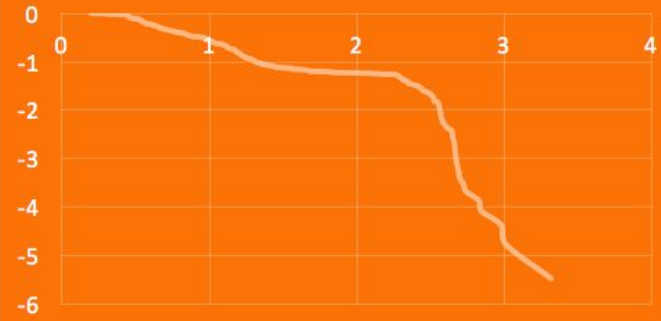
Histogram using logarithmic binning



Cumulative Distribution Function



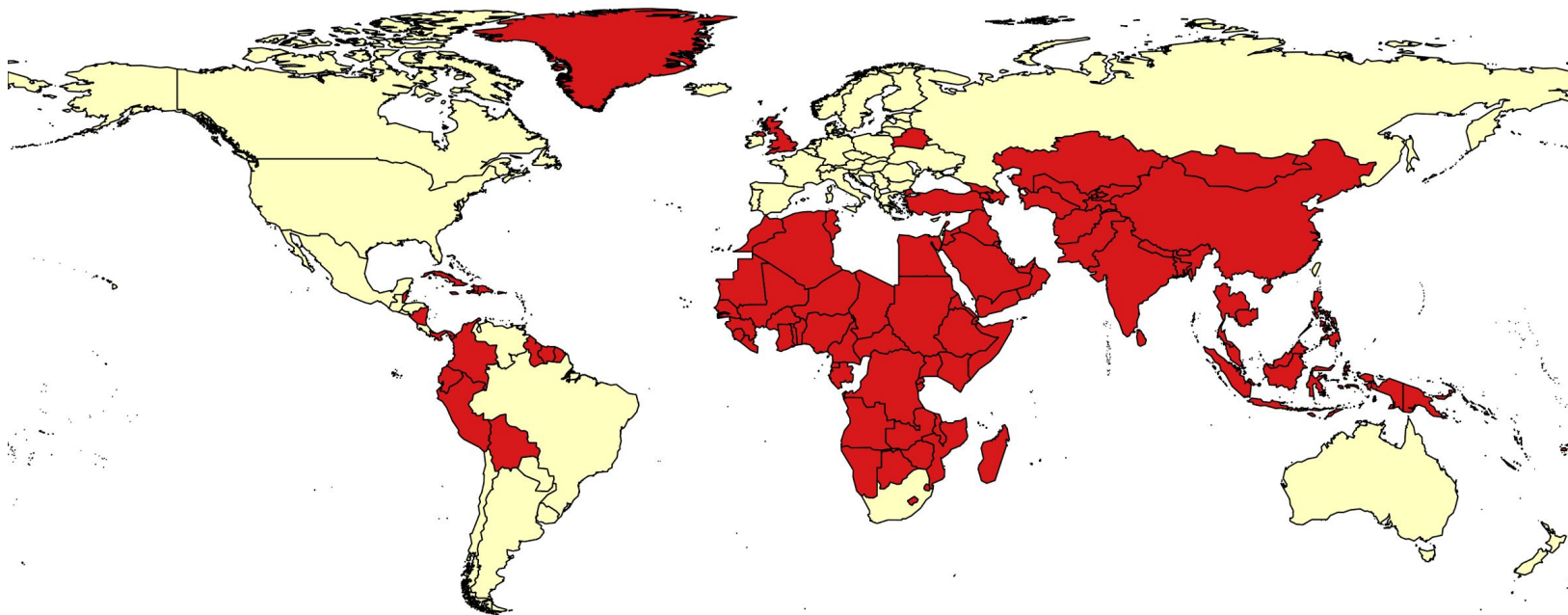
LOG-LOG GRAPH OF CDF



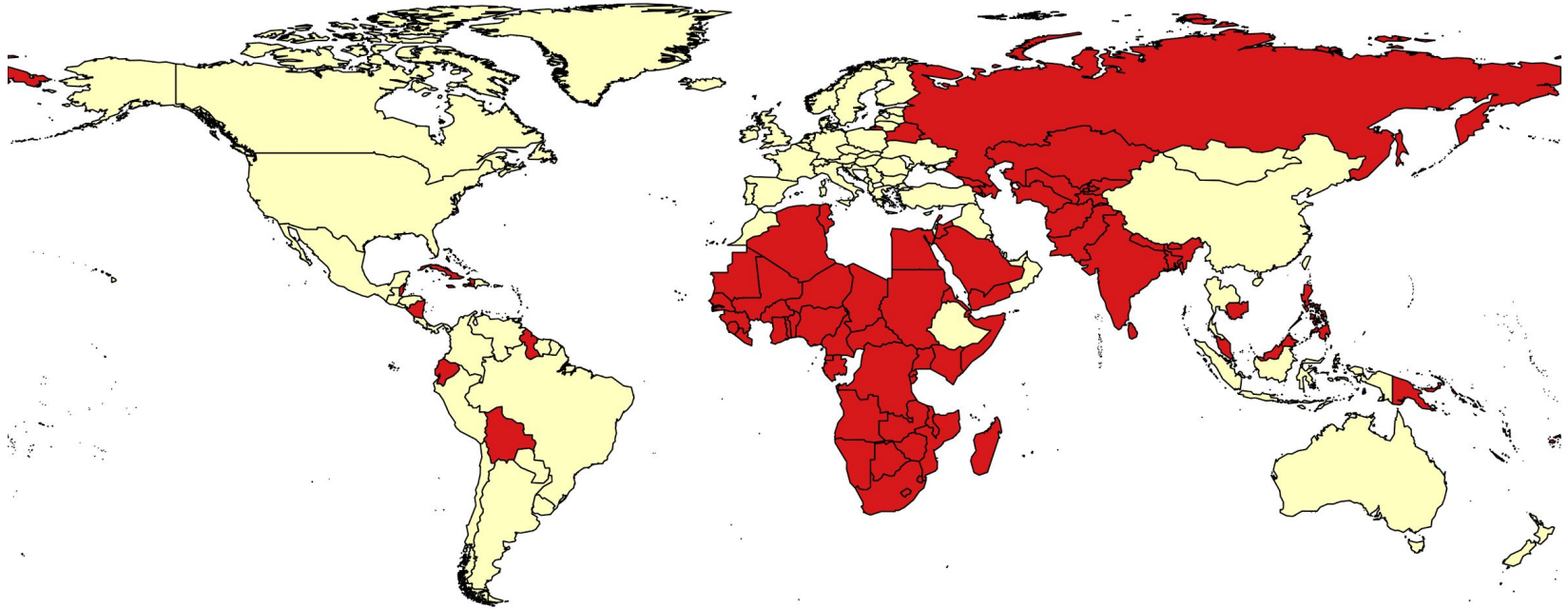
Assortativity

<i>Interpretations</i>
Grouping by Africa countries and Non-Africa countries gives the highest assortativity coefficient

Group according to	Modularity: (Q, Qmax)	Assortativity Coefficient
Continent	(0.0799, 0.8406)	0.0951
Level of Development	(0.0661, 0.5130)	0.1288
Africa & Non-Africa	(0.0476, 0.2554)	0.1863



Spectral Modularity Maximization (0.26)



Simple Modularity Maximization (0.34)

Assortative Mixing by Degree

- Correlation Coefficient equals to 0.2020 > 0
 - Countries are more willing to loosen access to countries that have popular passports
 - Indicate the bilateral feature of visa reduction relationship
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Summary

- Structural density of visa requirement network
 - Cocitation & bibliographic coupling
 - Centrality as a measure of power of passport
 - Assortative mixing by geography
 - A good model to organize information and gain insights
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Future Improvements

There is always more to do.

- Minimise manual inspection
- Differentiate different levels of visa policies
- Explore more geo-political factors
