European Commission

June 2023

Problem with 'S.A.' node.

1 Model using hypergraphs or graphs?

1.1 Hpyergraph

Number of hyperedges: 11214 Number of entities (nodes): 4541

Number of edges in a bipartite graph 32501

Mean cardinality: 2.90 Std cardinality: 2.25

- Correlation between centralities of hyperedges.

	Betweenness	Closeness	Cardinality
Betweenness	1.000000	0.514992	0.732040
Closeness	0.514992	1.000000	0.397166
Cardinality	0.732040	0.397166	1.000000

[⇒] big hyperedges have a high cardinality

1.2 Graph

Number of entities (nodes): 4541

Number of edges: 35139

2 Centralities

2.1 Degree

2.2 Betweenness

2.3 Eigenvector

3 Correlation between E.U. grant and centralities

restrict graph to organisation appearing the E.U. transparency register. Number of nodes = 3637

The network still connected

THE HELWOIK S	im connected			
	Members FTE	Eigenvector	Degree	Betweenness
E.U. Grants	0.002598	0.008545	0.028295	0.015429

[⇒] No significant correlation

$\bullet\,$ problem when downloading the data. The seperator ',' appears in organization name

	count	proportion
Category of registration		
Companies and groups	1199	0.27
Non-governmental organisations, platforms and networks and similar	954	0.21
Trade and business associations	813	0.18
NaN	734	0.16
Trade unions and professional associations	237	0.05
Think tanks and research institutions	171	0.04
Professional consultancies	137	0.03
Other organisations, public or mixed entities	113	0.03
Academic institutions	79	0.02
Associations and networks of public authorities	42	0.01
Organisations representing churches and religious communities	15	0.00
Law firms	14	0.00
Self-employed individuals	9	0.00

	count	proportion
Country		
BELGIUM	953	0.210934
NaN	734	0.162461
GERMANY	420	0.092961
FRANCE	346	0.076583
NETHERLANDS	274	0.060646
UNITED STATES	255	0.056441
UNITED KINGDOM	229	0.050686
SPAIN	140	0.030987
ITALY	129	0.028552
FINLAND	114	0.025232
SWITZERLAND	94	0.020806
SWEDEN	84	0.018592
IRELAND	81	0.017928
AUSTRIA	78	0.017264
DENMARK	78	0.017264
POLAND	71	0.015715
CZECH REPUBLIC	39	0.008632
PORTUGAL	39	0.008632
LUXEMBOURG	38	0.008411
NORWAY	34	0.007525

4 Orbis data base

- Problem with separators solved by scraping eu web sites
- Add director general meetings. Need to specify a minimal date above which meeting should be taken into account (2019 beginning of the mandate)
- Match organization names with orbis detabase. Orbis keep the A scored matches + manual matching of the non-automatically matched.
- cleaning data:
 - in EU meeting, there are a few entities that have been mistyped. Use a dictionnary to search and replace these entities.
 - Names with double spacing or " are not let unchanged with the orbis matching. This concerns 22 organization names. Solved by manually restore the original names in the organization names files. Export organization names i.xlsx
 - drop duplicates in orbis data.
 - drop duplicates in transparency register
 - Problem with export for some french organizations. The information are well displayed in the orbis website but do not appear in the export excel datafile.
- How to consider the GUO? Issues :
 - Sometimes it is the state, so no financial data
 - should we collapse node the the hypergraph corresponding to the GUO, or just replace the financial data of the corresponding entities

Total number of organizations = 4517

Number of matched organizations in Orbis = 3646 (93.67 %)

Number of duplicated orga in Orbis = 63

Number of matched organization in TR = 3784 (83.77 %)

Number of organization in TR but not in Orbis = 700

Number of organization matched in Orbis but not in TR = 562

Number of organization with known revenue = 2000 (44.28 %)

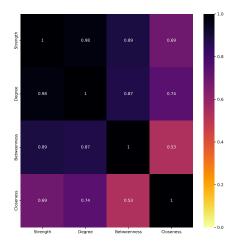
Number of organization with known nb employees = 2619 (57.98 %)

Number of organization with known assets = 2106 (46.62 %)

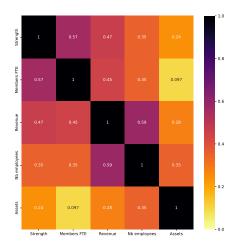
5 Analysis of companies

- Data = restrict entities to companies and groups.
- Goal = What companies feature explains the best their influence.
- Null hypothesis: companies influence should be proportional to their size and only depend on their size.

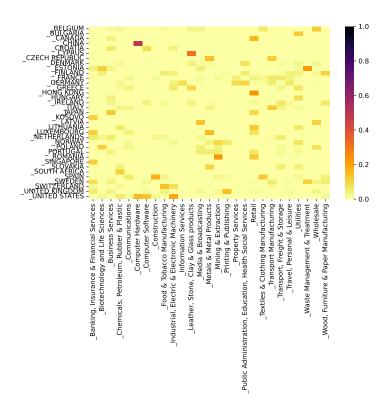
5.1 Correlation study



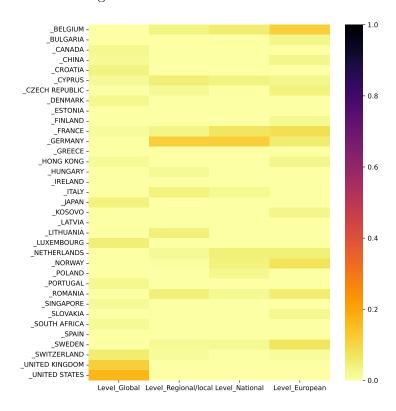
=> Strength, degree and betweenness are highly correlated. Focus on strength as dependent variable.

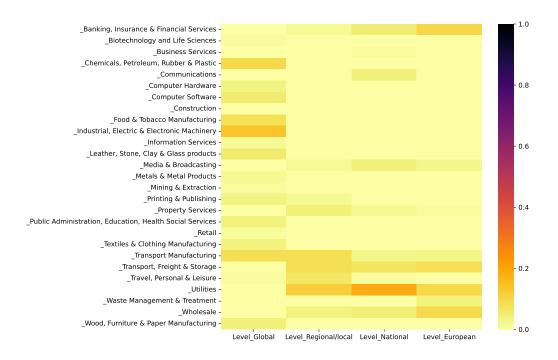


- Concerning financial data, revenue and number of employees are highly correlated correlated. Surprisingly, the assets are weakly correlated to revenue and number of employees.
- Strength is highly correlated to Members FTE (expected). Relatively good correlation between Strength and Revenue.

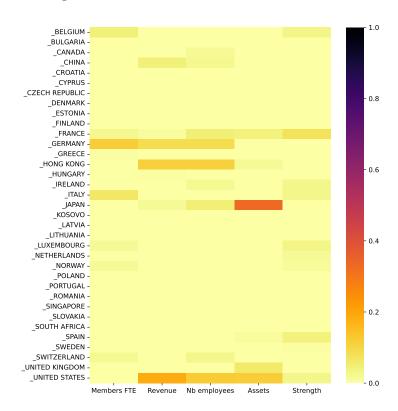


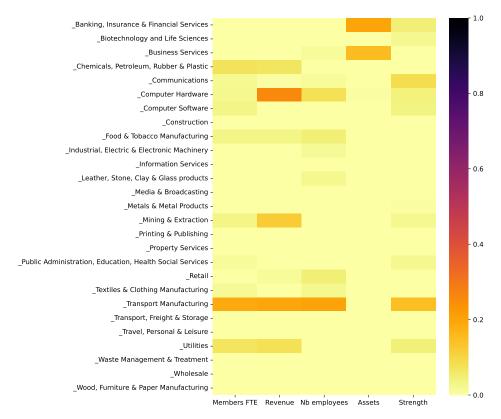
- High correlation between china and computer hardware. There is only one chinese company : Lenovo.
- No other significant correlation.

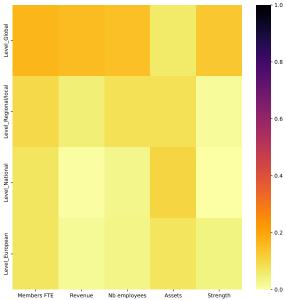




• No significant relation.





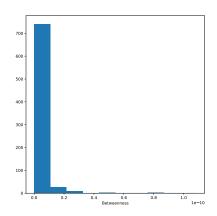


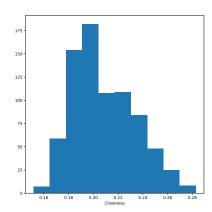
5.2 Clean data

5.2.1 Continuous

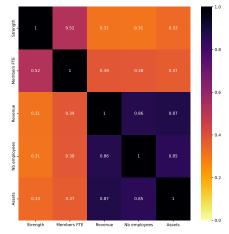
	Skew
Assets	6.833269
Nb employees	5.299134
Revenue	5.169145
Strength	4.095580
Degree	3.388787
Members FTE	3.032618
Closeness	0.495796
Betweenness	0.000000

- Numerical data are highly skewed.
- Closeness and Betweeneess seems to not be skewed. The plots shows that Betweenness is highly skewed. Should we normalize the centrality vector? This is surprising beacause, skeweness = $\mathbb{E}[(\frac{X-\mu}{\sigma})^3]$

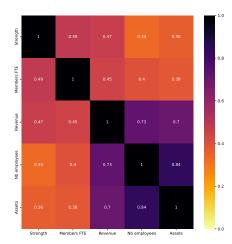




- To handle skewness of variables, transform data. Use log transform and yeojohnson transform. To use log transform, we have to add 1 to all values to handle null values. And there is a company with negative revenue (Airholding S.A.). For the log transform, it has been removed.
- log transform of independant variables.



• yeojohnson of independant variables



- Strengthen the correlation between financial data.
- Changes slightly the correlation between strength and the other variables. Except for assets which is considerably higher. The correlation between members FTE and assets also increases.

5.2.2 Categorical

Categorical data are also highly skewed, in the sense that there are some categories that embed a low proportion of companies. Possible ways to overcome the problem: Remove outliers, or form fewer and larger categories, for instance group of countries.

• Removing outliers: Define a frequency threshold under which the categories are considered to be very rare. All companies belonging to these categories are deleted.

For thres =1%,

removed category: ['LUXEMBOURG', 'JAPAN', 'SLOVAKIA', 'CROATIA', 'ROMANIA', 'LITHUANIA', 'HUNGARY', 'CZECH REPUBLIC', 'CANADA', 'LATVIA', 'CYPRUS', 'CHINA', 'KOSOVO', 'SOUTH AFRICA', 'SINGAPORE', 'BULGARIA', 'HONG KONG']

number of outliers: 41

removed category: ['Wood, Furniture and Paper Manufacturing', 'Biotechnology and Life Sciences', 'Construction', 'Public Administration, Education, Health Social Services', 'Textiles and Clothing Manufacturing', 'Agriculture, Horticulture and Livestock', 'Computer Hardware', 'Property Services', 'Waste Management and Treatment', 'Information Services']

number of outliers: 41

• Group country per region: 'North America': ['CANADA', 'UNITED STATES'], 'North Europe': ['NOR-WAY', 'FINLAND', 'DENMARK', 'SWEDEN', 'LITHUANIA', 'LATVIA', 'ESTONIA', 'UNITED KING-DOM', 'IRELAND'], 'South Europe': ['ITALY', 'SPAIN', 'PORTUGAL', 'GREECE', 'CROATIA', 'CYPRUS'], 'East Europe': ['CZECH REPUBLIC', 'POLAND', 'ROMANIA', 'HUNGARY', 'BULGARIA', 'SLOVAKIA', 'KOSOVO'], 'West Europe': ['AUSTRIA', 'GERMANY', 'SWITZERLAND', 'BELGIUM', 'LUXEMBOURG', 'FRANCE', 'NETHERLANDS'], 'East Asia': ['JAPAN', 'CHINA', 'HONG KONG'], 'Other': ['SOUTH AFRICA', 'SINGAPORE']

and remove outliers: removed category: ['East Asia', 'Other'] number of outliers: 9

removed category: ['Construction', 'Biotechnology and Life Sciences', 'Wood, Furniture and Paper Manufacturing', 'Textiles and Clothing Manufacturing', 'Public Administration, Education, Health Social Services', 'Agriculture, Horticulture and Livestock', 'Computer Hardware', 'Property Services', 'Waste Management and Treatment', 'Information Services']

number of outliers: 41

5.3 Regression

Dep. Variable:	S	trength	R-s	quared:		0.287
Model:		OLS	\mathbf{Ad}	j. R-squ	ared:	0.285
Method:	Lea	st Squares	\mathbf{F}	tatistic:		140.7
Date:	jeu., 2	23 nov. 20)23 Pr c	b (F-sta	atistic):	4.61e-52
Time:	1	1:27:28	Log	g-Likelih	ood:	-2582.7
No. Observations:		701	AIC	:		5171.
Df Residuals:		698	BIG	C:		5185.
Df Model:		2				
Covariance Type:	no	onrobust				
	coef	std err	t	$P> \mathbf{t} $	[0.025]	0.975]
const	-7.2380	1.741	-4.157	0.000	-10.657	-3.819
Members FTE	9.1169	0.673	13.550	0.000	7.796	10.438
Revenue	0.4766	0.129	3.704	0.000	0.224	0.729
Omnibus:	617	7.203 D	urbin-W	atson:	2.0	19
Prob(Omnibu	s): 0.	000 J	arque-Be	era (JB)	: 22252	2.246
Skew:	3.	801 P	$\operatorname{rob}(\operatorname{JB})$:	0.0	00
Kurtosis:	29	.534 C	ond. No	•	70	.6

^[1] Standard Errors assume that the covariance matrix of the errors is correctly specified.

Dep. Variable:	Strength		R-squa	red:	0.3	0.311	
Model:	OLS	5	Adj. R		d: 0.2	0.290	
Method:	Least Sq	uares	F-statis	stic:	15	15.32	
Date:	jeu., 23 no	jeu., 23 nov. 2023 F		F-statis	tic): 6.51	e-43	
Time:	11:28:	13	Log-Lil	celihood	d: -25	71.0	
No. Observations:	701		AIC:		51	84.	
Df Residuals:	680		BIC:		52	80.	
Df Model:	20						
Covariance Type:	nonrob	oust					
	coef	std err	t	P> t	[0.025]	0.975]	
const	-10.2761	2.933	-3.504	0.000	-16.035	-4.517	
Members FTE	9.2331	0.688	13.422	0.000	7.882	10.584	
Revenue	0.4996	0.136	3.668	0.000	0.232	0.767	
BELGIUM	2.8760	2.891	0.995	0.320	-2.801	8.553	
DENMARK	0.4822	3.025	0.159	0.873	-5.457	6.422	
ESTONIA	5.0852	5.0852 4.393 1.158 0		0.247	-3.540	13.710	
FINLAND	2.3868	2.801	0.852	0.394	-3.113	7.887	
FRANCE	4.6145	2.582	1.787	0.074	-0.455	9.684	
GERMANY	1.2260	2.511	0.488	0.626	-3.705	6.157	
GREECE	-1.1554	4.134	-0.280	0.780	-9.272	6.961	
IRELAND	6.8335	2.984	2.290	0.022	0.975	12.692	
ITALY	2.0536	2.776	0.740	0.460	-3.398	7.505	
NETHERLANDS	2.6211	2.621	1.000	0.318	-2.526	7.768	
NORWAY	3.2760	3.477	0.942	0.346	-3.550	10.102	
POLAND	-0.8174	3.966	-0.206	0.837	-8.605	6.970	
PORTUGAL	1.8545	4.133	0.449	0.654	-6.261	9.970	
SPAIN	5.5172	2.845	1.940	0.053	-0.068	11.102	
SWEDEN	4.5191	2.875	1.572	0.116	-1.125	10.163	
SWITZERLAND	0.8798	3.354	0.262	0.793	-5.705	7.465	
UNITED KINGDOM	1.1134	2.600	0.428	0.669	-3.992	6.219	
UNITED STATES	2.7759	2.617	1.061	0.289	-2.363	7.915	
Omnibus:	615.500	Durbi	in-Watso	on:	2.040		
Prob(Omnibus):	0.000	Jarqu	e-Bera ((JB):	22797.653		
Skew:	3.771	Prob(JB):	· ·	0.00		
Kurtosis:	29.900	Cond			423.		

^[1] Standard Errors assume that the covariance matrix of the errors is correctly specified.

Dep. Variable:	Strength		R-squar	red:	0.318	
Model:	OLS	S	Adj. R	-square	ed: 0.294	
Method:	Least Sq	uares	F-statistic:		13.16	
Date:	jeu., 23 no	v. 2023	Prob (F-statis		ic): 3.82	e-42
Time:	11:28:53		Log-Lik	elihood	: -25	67.0
No. Observations:	701		AIC:		51	84.
Df Residuals:	676		BIC:		52	98.
Df Model:	24					
Covariance Type:	nonrob	oust				
	\mathbf{coef}	std err	t	$\mathbf{P} > \mathbf{t} $	[0.025]	0.975]
const	-11.0216	3.015	-3.655	0.000	-16.942	-5.101
Members FTE	9.0917	0.700	12.980	0.000	7.716	10.467
Revenue	0.5220	0.137	3.818	0.000	0.254	0.790
$\mathbf{BELGIUM}$	2.6915	2.895	0.930	0.353	-2.993	8.376
DENMARK	0.3113	3.025	0.103	0.918	-5.628	6.251
ESTONIA	5.8645	4.402	1.332	0.183	-2.779	14.508
FINLAND	2.2054	2.797	0.788	0.431	-3.287	7.698
FRANCE	4.4594	2.584	1.726	0.085	-0.614	9.533
GERMANY	1.3168	2.511	0.524	0.600	-3.614	6.248
GREECE	-1.5470	4.127	-0.375	0.708	-9.651	6.557
IRELAND	6.6049	2.980	2.216	0.027	0.753	12.457
ITALY	2.1511	2.770	0.777	0.438	-3.288	7.590
NETHERLANDS	2.5494	2.620	0.973	0.331	-2.595	7.694
NORWAY	3.0331	3.480	0.872	0.384	-3.800	9.866
POLAND	-0.3867	3.964	-0.098	0.922	-8.170	7.397
PORTUGAL	1.7514	4.137	0.423	0.672	-6.372	9.875
SPAIN	5.4544	2.840	1.921	0.055	-0.121	11.030
\mathbf{SWEDEN}	4.4722	2.871	1.558	0.120	-1.165	10.110
SWITZERLAND	0.4808	3.356	0.143	0.886	-6.109	7.070
UNITED KINGDOM	0.6191	2.613	0.237	0.813	-4.511	5.749
UNITED STATES	2.1259	2.639	0.806	0.421	-3.055	7.307
$Level_Global$	1.3881	0.977	1.420	0.156	-0.531	3.307
${f Level_Regional/local}$	-1.1356	1.049	-1.083	0.279	-3.195	0.924
${\bf Level_National}$	-1.4276	1.153	-1.238	0.216	-3.692	0.836
Level_European	1.2431	1.089	1.142	0.254	-0.894	3.380
Omnibus:	605.403	Durbi	in-Watso	n:	2.038	
Prob(Omnibus)		_	e-Bera (JB):	21348.090	
Skew:	3.692	$\operatorname{Prob}($			0.00	
Kurtosis:	29.007	Cond	No.		425.	_

^[1] Standard Errors assume that the covariance matrix of the errors is correctly specified.

Dep. Variable:	Strength	R-squared:	0.351
Model:	OLS	Adj. R-squared:	0.311
Method:	Least Squares	F-statistic:	8.699
Date:	jeu., 23 nov. 2023	Prob (F-statistic):	8.16e-40
Time:	11:29:55	Log-Likelihood:	-2549.8
No. Observations:	701	AIC:	5184.
Df Residuals:	659	BIC:	5375.
Df Model:	41		
Covariance Type:	nonrobust		

	\mathbf{coef}	std err	\mathbf{t}	$\mathbf{P} > \mathbf{t} $	[0.025]	0.975]
const	-9.6483	3.326	-2.901	0.004	-16.179	-3.118
Members FTE	8.7702	0.713	12.295	0.000	7.370	10.171
Revenue	0.5868	0.143	4.092	0.000	0.305	0.868
BELGIUM	3.2086	2.895	1.108	0.268	-2.477	8.894
DENMARK	0.2917	3.012	0.097	0.923	-5.623	6.206
ESTONIA	5.2046	4.390	1.186	0.236	-3.415	13.824
FINLAND	1.9550	2.807	0.696	0.486	-3.557	7.467
FRANCE	3.8888	2.600	1.496	0.135	-1.216	8.994
GERMANY	1.0856	2.526	0.430	0.667	-3.874	6.045
GREECE	-1.7418	4.108	-0.424	0.672	-9.808	6.324
IRELAND	6.3297	2.990	2.117	0.035	0.459	12.200
ITALY	1.6211	2.792	0.581	0.562	-3.861	7.103
NETHERLANDS	2.0650	2.644	0.781	0.435	-3.126	7.256
NORWAY	1.9121	3.477	0.550	0.583	-4.915	8.739
POLAND	-0.2493	3.962	-0.063	0.950	-8.028	7.529
PORTUGAL	1.8072	4.143	0.436	0.663	-6.327	9.941
SPAIN	4.7100	2.850	1.653	0.099	-0.886	10.306
SWEDEN	3.5027	2.892	1.211	0.226	-2.177	9.182
SWITZERLAND	0.7414	3.381	0.219	0.826	-5.898	7.380
UNITED KINGDOM	0.1752	2.641	0.066	0.947	-5.011	5.361
UNITED STATES	1.3205	2.669	0.495	0.621	-3.920	6.561
Level_Global	2.0791	1.013	2.052	0.041	0.089	4.069
Level_Regional/local	-1.0351	1.049	-0.986	0.324	-3.096	1.026
Level_National	-2.2249	1.172	-1.898	0.058	-4.526	0.076
Level_European	1.5886	1.096	1.449	0.148	-0.564	3.741
Business Services	-1.4587	1.445	-1.010	0.313	-4.296	1.378
Chemicals, Petroleum, Rubber and Plastic	-5.1945	1.713	-3.033	0.003	-8.558	-1.831
Communications	2.2225	2.029	1.095	0.274	-1.761	6.206
Computer Software	-0.1384	2.349	-0.059	0.953	-4.751	4.475
Food and Tobacco Manufacturing	-6.2101	2.003	-3.101	0.002	-10.142	-2.278
Industrial, Electric and Electronic Machinery		1.700	-1.083	0.279	-5.178	1.497
Leather, Stone, Clay and Glass products		3.476	-1.865	0.063	-13.305	0.344
Media and Broadcasting	-3.5353	2.324	-1.521	0.129	-8.098	1.028
Metals and Metal Products	-4.6243	2.683	-1.723	0.085	-9.893	0.644
Mining and Extraction	-2.1339	2.474 3.038	-0.863	0.389	-6.991	2.724
Printing and Publishing Retail	-0.3381 -2.1808	3.134	-0.111 -0.696	$0.911 \\ 0.487$	-6.303 -8.335	5.627 3.974
						5.040
Transport Manufacturing Transport, Freight and Storage	0.7652 -2.9440	2.177 1.835	0.351 -1.604	$0.725 \\ 0.109$	-3.510 -6.547	0.659
Travel, Personal and Leisure	-2.9440 -2.3682	2.619	-0.904	0.109 0.366	-0.547 -7.510	0.059 2.774
Utilities	-2.3082 -0.3491	1.818	-0.904 -0.192	0.300 0.848	-7.510 -3.918	$\frac{2.774}{3.220}$
Wholesale	-3.9676	1.973	-0.192	0.045	-3.918 -7.841	-0.094
					-1.041	-0.034
Omnibus: 597.253	Durbin-			053		
Prob(Omnibus): 0.000	_	Bera (JB)		03.587		
Skew: 3.617	Prob(JB	*		.00		
Kurtosis: 28.689	Cond. N	10.	4.	32.		

^[1] Standard Errors assume that the covariance matrix of the errors is correctly specified.

Dep. Variable:	Strength	R-squared:	0.429
Model:	$\overline{\mathrm{OLS}}$	Adj. R-squared:	0.353
Method:	Least Squares	F-statistic:	5.654
Date:	jeu., 23 nov. 2023	Prob (F-statistic):	1.11e-37
Time:	11:30:54	Log-Likelihood:	-2505.2
No. Observations:	701	AIC:	5176.
Df Residuals:	618	BIC:	5554.
Df Model:	82		
Covariance Type:	nonrobust		

	\mathbf{coef}	std err	\mathbf{t}	$\mathbf{P} > \mathbf{t} $	[0.025]	0.975]
const	-7.1791	3.445	-2.084	0.038	-13.945	-0.414
Members FTE	7.7117	0.766	10.067	0.000	6.207	9.216
Revenue	0.4816	0.153	3.141	0.002	0.181	0.783
BELGIUM	1.3619	2.933	0.464	0.643	-4.397	7.121
DENMARK	-0.3392	3.073	-0.110	0.912	-6.374	5.695
ESTONIA	4.0585	4.408	0.921	0.358	-4.599	12.716
FINLAND	0.5963	2.891	0.206	0.837	-5.080	6.273
FRANCE	2.5189	2.692	0.936	0.350	-2.767	7.805
GERMANY	0.3481	2.581	0.135	0.893	-4.720	5.416
GREECE	-4.0497	4.113	-0.985	0.325	-12.127	4.027
IRELAND	4.2560	3.038	1.401	0.162	-1.710	10.222
ITALY	0.2485	2.822	0.088	0.930	-5.293	5.790
NETHERLANDS	1.5577	2.672	0.583	0.560	-3.689	6.805
NORWAY	1.6716	3.527	0.474	0.636	-5.254	8.597
POLAND	-1.7669	3.966	-0.446	0.656	-9.555	6.022
PORTUGAL	-1.1727	4.196	-0.279	0.780	-9.412	7.067
SPAIN	3.0787	2.878	1.070	0.285	-2.574	8.731
SWEDEN	2.4669	2.905	0.849	0.396	-3.238	8.172
SWITZERLAND	0.3235	3.398	0.095	0.924	-6.349	6.996
UNITED KINGDOM	-1.1348	2.677	-0.424	0.672	-6.392	4.122
UNITED STATES	-0.6984	2.741	-0.255	0.799	-6.082	4.685
$Level_Global$	1.6715	1.024	1.632	0.103	-0.340	3.683
${ m Level_Regional/local}$	-1.0556	1.055	-1.001	0.317	-3.127	1.016
Level_National	-2.5848	1.190	-2.171	0.030	-4.923	-0.247
Level_European	1.7099	1.087	1.573	0.116	-0.424	3.844
Business Services	-1.7561	1.642	-1.070	0.285	-4.980	1.468
Chemicals, Petroleum, Rubber and Plastic	-3.3235	2.060	-1.613	0.107	-7.369	0.722
Communications	1.0358	2.303	0.450	0.653	-3.487	5.558
Computer Software	-0.4606	2.466	-0.187	0.852	-5.302	4.381
Food and Tobacco Manufacturing	-3.4284	2.543	-1.348	0.178	-8.422	1.565
Industrial, Electric and Electronic Machinery	-2.1832	1.962	-1.113	0.266	-6.036	1.670
Leather, Stone, Clay and Glass products	-7.2859	3.641	-2.001	0.046	-14.436	-0.135
Media and Broadcasting	-5.3056	2.632	-2.016	0.044	-10.474	-0.137
Metals and Metal Products	-4.9443	2.921	-1.692	0.091	-10.682	0.793
Mining and Extraction	-2.4928	2.669	-0.934	0.351	-7.735	2.749
Printing and Publishing	-0.5079	3.158	-0.161	0.872	-6.709	5.693
Retail	-2.6218	3.216	-0.815	0.415	-8.937	3.693
Transport Manufacturing	1.0932	2.400	0.456	0.649	-3.619	5.805
Transport, Freight and Storage	-2.9095	2.184	-1.332	0.183	-7.199	1.380
Travel, Personal and Leisure	-2.6942	2.844	-0.947	0.344	-8.279	2.890

TT#:I:#:og	0.2002	9 109	0.120	0.901	-4.420	3.841
Utilities Wholesale	-0.2893 -3.9665	2.103 2.233	-0.138 -1.776	$0.891 \\ 0.076$	-4.420 -8.352	0.419
Field_Economy	-3.9003 -1.5933	1.590	-1.002	0.070 0.317	-6.332 -4.716	1.529
Field_Enlargement	-0.7607	1.486	-0.512	0.609	-3.680	2.158
Field_Food safety	-0.7607 -1.2572	1.374	-0.915	0.361	-3.956	1.442
Field_Trans-European Networks	-1.7327	1.083	-1.600	0.301 0.110	-3.860	0.394
Field_Business and industry	-0.1144	0.984	-0.116	0.110	-2.048	1.819
Field_Agriculture and rural development	-2.9188	2.417	-1.208	0.228	-2.645	1.827
Field_Youth	2.9097	1.730	1.681	0.228 0.093	-0.489	6.308
Field_Migration and asylum	1.4437	2.790	0.517	0.605	-4.036	6.923
Field_Climate action	1.5710	1.073	1.464	0.144	-0.536	3.678
Field_Trade	2.0820	0.977	2.130	0.034	0.163	4.001
Field_Sport	-5.8767	3.427	-1.715	0.087	-12.607	0.854
Field_Borders and security	0.9023	1.384	0.652	0.515	-1.816	3.621
Field_Culture and media	1.8925	2.209	0.857	0.392	-2.445	6.230
Field_Humanitarian aid and civil protection	-2.4737	1.802	-1.372	0.170	-6.013	1.066
Field_Single market	0.9921	1.113	0.892	0.373	-1.193	3.177
Field_finance and the euro	-0.1283	1.170	-0.110	0.913	-2.426	2.169
Field_Education and training	-0.2808	1.183	-0.237	0.812	-2.604	2.043
Field_Fraud prevention	0.7954	1.378	0.577	0.564	-1.912	3.502
Field_Transport	7.1557	3.461	2.067	0.039	0.359	13.953
Field_Taxation	0.6829	0.993	0.688	0.492	-1.267	2.633
Field_Institutional affairs	1.1452	0.994	1.152	0.250	-0.807	3.097
Field_International co-operation and development	1.5110	1.023	1.477	0.140	-0.498	3.520
Field_Customs	-2.8678	1.028	-2.789	0.005	-4.887	-0.849
Field_External relations	-0.2037	1.034	-0.197	0.844	-2.234	1.827
Field_Banking and financial services	-0.7748	1.064	-0.728	0.467	-2.865	1.316
Field_Maritime affairs and fisheries	-1.4304	1.521	-0.940	0.347	-4.417	1.556
${f Field_Competition}$	-0.3602	1.060	-0.340	0.734	-2.443	1.722
${f Field_Energy}$	1.1932	1.031	1.157	0.248	-0.832	3.218
Field_Public health	-1.7018	1.129	-1.507	0.132	-3.920	0.516
${f Field_Environment}$	-1.1906	1.152	-1.034	0.302	-3.452	1.071
Field_Justice and fundamental rights	2.4680	1.117	2.210	0.027	0.275	4.661
${f Field_Culture}$	1.6607	2.279	0.729	0.466	-2.815	6.136
${f Field_Consumers}$	0.8107	0.980	0.827	0.408	-1.114	2.735
Field_Regional policy	0.5272	1.173	0.449	0.653	-1.777	2.831
Field_Research and innovation	-1.1395	0.957	-1.191	0.234	-3.019	0.740
Field_Digital economy and society	0.5198	1.254	0.415	0.679	-1.942	2.982
Field_Communication	-2.8663	1.153	-2.486	0.013	-5.131	-0.602
Field_European neighbourhood policy	-1.6818	1.974	-0.852	0.395	-5.559	2.196
Field_Budget	2.1216	1.198	1.771	0.077	-0.231	4.474
Field_Employment and social affairs	0.5258	0.997	0.527	0.598	-1.433	2.485
Field_Foreign affairs and security policy	0.2724	1.141	0.239	0.811	-1.968	2.513

Omnibus:	508.915	Durbin-Watson:	1.997
Prob(Omnibus):	0.000	Jarque-Bera (JB):	12246.707
Skew:	2.950	Prob(JB):	0.00
Kurtosis:	22.608	Cond. No.	461.

^[1] Standard Errors assume that the covariance matrix of the errors is correctly specified.

Group countries

Dep. Variable:	S	Strength	R-s	squared:		0.291
Model:		OLS	\mathbf{Ad}	j. R-squ	ared:	0.285
Method:	Lea	st Squares	F-s	tatistic:		49.56
Date:	jeu., 2	23 nov. 20	23 Pro	ob (F-sta	atistic):	4.30e-51
Time:	1	3:29:30	Log	g-Likelih	ood:	-2692.7
No. Observations	S:	733	AI	C:		5399.
Df Residuals:		726	BIG	C:		5432.
Df Model:		6				
Covariance Type	: no	onrobust				
	coef	std err	t	\mathbf{P} > $ \mathbf{t} $	[0.025]	0.975]
const	-7.4138	2.199	-3.372	0.001	-11.731	-3.097
Members FTE	8.9676	0.660	13.579	0.000	7.671	10.264
Revenue	0.5054	0.126	3.996	0.000	0.257	0.754
East Europe	-2.7490	2.345	-1.172	0.241	-7.353	1.855
North Europe	0.0925	1.329	0.070	0.945	-2.517	2.702
South Europe	0.2673	1.529	0.175	0.861	-2.734	3.268
West Europe	-0.2286	1.273	-0.180	0.857	-2.727	2.270
Omnibus:	643	3.431 D	urbin-W	Vatson:	2.0	00
Prob(Omnib	us): 0.	000 J a	arque-Be	era (JB)	: 23420	0.226
Skew:	3.	794 P :	rob(JB)	:	0.0	00
Kurtosis:	29	.631 C	ond. No).	13	0.

Notes:

[1] Standard Errors assume that the covariance matrix of the errors is correctly specified.

	\mathbf{coef}	std err	t	$\mathbf{P} > \mathbf{t} $	[0.025	0.975]
const	-10.1629	2.625	-3.871	0.000	-15.317	-5.009
Members FTE	8.9676	0.660	13.579	0.000	7.671	10.264
Revenue	0.5054	0.126	3.996	0.000	0.257	0.754
North America	2.7490	2.345	1.172	0.241	-1.855	7.353
North Europe	2.8415	2.142	1.327	0.185	-1.363	7.046
South Europe	3.0164	2.267	1.330	0.184	-1.435	7.467
West Europe	2.5204	2.115	1.192	0.234	-1.632	6.673
Omnibus:	643	.431 D u	ırbin-W	atson:	2.00	00
Prob(Omnib	ous): 0.0	\mathbf{Ja}	rque-Be	ra (JB):	23420.	.226
Skew:	3.7	794 Pr	ob(JB):		0.00	0
Kurtosis:	29.	631 C o	nd. No.	•	195	

Notes:

[1] Standard Errors assume that the covariance matrix of the errors is correctly specified.

Dep. Variable:	Stren	_	R-squared:			298
Model:	OL	-	Adj. R	k-square	ed: 0.289	
Method:	Least So	quares	F-stati			0.71
Date:	jeu., 23 no	ov. 2023	Prob (F-statis	stic): 1.65	3e-49
Time:	13:32	2:30	$\operatorname{Log-Li}$	kelihoo	d: -26	88.7
No. Observations:	733	3	AIC:		53	899.
Df Residuals:	72	2	BIC:		54	50.
Df Model:	10)				
Covariance Type:	nonro	bust				
	coef	std err	t	P> t	[0.025]	0.975]
const	-10.6712	2.702	-3.949	0.000	-15.977	-5.365
Members FTE	8.8800	0.672	13.220	0.000	7.561	10.199
Revenue	0.5289	0.127	4.168	0.000	0.280	0.778
North America	2.1840	2.423	0.901	0.368	-2.573	6.941
North Europe	2.6081	2.175	1.199	0.231	-1.663	6.879
South Europe	2.9697	2.295	1.294	0.196	-1.536	7.475
West Europe	2.4348	2.146	1.134	0.257	-1.779	6.648
$Level_Global$	1.0013	0.926	1.081	0.280	-0.817	2.820
$Level_Regional/local$	-1.1832	1.001	-1.182	0.238	-3.149	0.782
$Level_National$	-1.5859	1.106	-1.434	0.152	-3.756	0.585
$Level_European$	1.4246	1.029	1.384	0.167	-0.596	3.445
Omnibus:	632.414	1 Durb	in-Wats	on:	2.003	
Prob(Omnibus): 0.000	Jarqu	ıe-Bera	(JB):	21852.233	
Skew:	3.712	Prob	(JB):		0.00	
Kurtosis:	28.698	Cond	. No.		199.	

^[1] Standard Errors assume that the covariance matrix of the errors is correctly specified.

Dep. Variable:	Strength	R-squared:	0.331
Model:	OLS	Adj. R-squared:	0.305
Method:	Least Squares	F-statistic:	12.90
Date:	jeu., 23 nov. 2023	Prob (F-statistic):	1.92e-45
Time:	13:33:41	Log-Likelihood:	-2671.4
No. Observations:	733	AIC:	5399.
Df Residuals:	705	BIC:	5528.
Df Model:	27		
Covariance Type:	nonrobust		

	coef	std err	t	\mathbf{P} > $ \mathbf{t} $	0.025	0.975]
const	-9.8675	2.972	-3.321	0.001	-15.702	-4.033
Members FTE	8.5444	0.681	12.551	0.000	7.208	9.881
Revenue	0.6008	0.133	4.517	0.000	0.340	0.862
North America	1.8480	2.459	0.752	0.453	-2.979	6.675
North Europe	2.4926	2.181	1.143	0.253	-1.789	6.774
South Europe	2.7453	2.289	1.199	0.231	-1.750	7.240
West Europe	2.4875	2.150	1.157	0.248	-1.734	6.709
$Level_Global$	1.6525	0.962	1.718	0.086	-0.236	3.541
Level_Regional/local	-1.0841	1.003	-1.081	0.280	-3.053	0.885
Level_National	-2.3131	1.119	-2.067	0.039	-4.510	-0.116
Level_European	1.7332	1.034	1.677	0.094	-0.296	3.763
Business Services	-1.1500	1.397	-0.823	0.411	-3.893	1.593
Chemicals, Petroleum, Rubber and Plastic	-5.1337	1.651	-3.109	0.002	-8.376	-1.891
Communications	2.0962	1.968	1.065	0.287	-1.767	5.959
Computer Software	0.1417	2.264	0.063	0.950	-4.304	4.587
Food and Tobacco Manufacturing	-6.0165	1.948	-3.088	0.002	-9.842	-2.191
Industrial, Electric and Electronic Machinery	-2.1871	1.627	-1.344	0.179	-5.382	1.008
Leather, Stone, Clay and Glass products	-6.5919	3.211	-2.053	0.040	-12.896	-0.288
Media and Broadcasting	-3.2243	2.246	-1.436	0.152	-7.633	1.185
Metals and Metal Products	-2.4320	2.412	-1.008	0.314	-7.167	2.303
Mining and Extraction	-1.7975	2.329	-0.772	0.440	-6.369	2.774
Printing and Publishing	-0.8801	2.973	-0.296	0.767	-6.717	4.956
Retail	-2.0107	2.692	-0.747	0.455	-7.297	3.275
Transport Manufacturing	1.1533	2.102	0.549	0.583	-2.973	5.280
Transport, Freight and Storage	-2.6240	1.779	-1.475	0.141	-6.117	0.869
Travel, Personal and Leisure	-1.9714	2.565	-0.768	0.442	-7.008	3.065
Utilities	-0.2866	1.722	-0.166	0.868	-3.667	3.094
Wholesale	-3.9236	1.899	-2.066	0.039	-7.653	-0.194
Omnibus: 624.930	Durbin-	Watson:	2.	027		
Prob(Omnibus): 0.000 Jarque-Bera (JB): 21402.863						

 Omnibus:
 624.930
 Durbin-Watson:
 2.027

 Prob(Omnibus):
 0.000
 Jarque-Bera (JB):
 21402.863

 Skew:
 3.644
 Prob(JB):
 0.00

 Kurtosis:
 28.449
 Cond. No.
 225.

^[1] Standard Errors assume that the covariance matrix of the errors is correctly specified.

Dep. Variable:	Strength	R-squared:	0.411
Model:	OLS	Adj. R-squared:	0.350
Method:	Least Squares	F-statistic:	6.801
Date:	jeu., 23 nov. 2023	Prob (F-statistic):	1.16e-42
Time:	13:34:12	Log-Likelihood:	-2624.8
No. Observations:	733	AIC:	5388.
Df Residuals:	664	BIC:	5705.
Df Model:	68		
Covariance Type:	nonrobust		

	\mathbf{coef}	std err	\mathbf{t}	$\mathbf{P} > \mathbf{t} $	[0.025]	0.975]
const	-9.1796	3.083	-2.977	0.003	-15.234	-3.125
Members FTE	7.4991	0.725	10.344	0.000	6.076	8.923
Revenue	0.4990	0.141	3.540	0.000	0.222	0.776
North America	1.7426	2.458	0.709	0.479	-3.084	6.569
North Europe	3.3687	2.182	1.544	0.123	-0.916	7.654
South Europe	3.1245	2.270	1.376	0.169	-1.333	7.582
West Europe	3.6671	2.144	1.710	0.088	-0.544	7.878
Level_Global	1.1984	0.971	1.235	0.217	-0.707	3.104
Level_Regional/local	-1.0506	1.009	-1.041	0.298	-3.032	0.931
Level_National	-2.5121	1.131	-2.221	0.027	-4.733	-0.292
Level_European	1.6598	1.020	1.627	0.104	-0.343	3.662
Business Services	-1.7294	1.580	-1.095	0.274	-4.832	1.373
Chemicals, Petroleum, Rubber and Plastic	-3.8723	1.979	-1.957	0.051	-7.758	0.013
Communications	0.8276	2.238	0.370	0.712	-3.567	5.222
Computer Software	-0.4865	2.357	-0.206	0.837	-5.115	4.142
Food and Tobacco Manufacturing	-3.8487	2.466	-1.561	0.119	-8.691	0.993
Industrial, Electric and Electronic Machinery	-2.8902	1.866	-1.549	0.122	-6.554	0.773
Leather, Stone, Clay and Glass products	-7.7020	3.365	-2.289	0.022	-14.308	-1.096
Media and Broadcasting	-5.1771	2.492	-2.077	0.038	-10.071	-0.283
Metals and Metal Products	-3.2724	2.665	-1.228	0.220	-8.506	1.961
Mining and Extraction	-2.2803	2.507	-0.909	0.363	-7.203	2.643
Printing and Publishing	-1.2443	3.073	-0.405	0.686	-7.278	4.790
Retail	-3.4746	2.774	-1.253	0.211	-8.922	1.973
Transport Manufacturing	1.1157	2.316	0.482	0.630	-3.432	5.664
Transport, Freight and Storage	-2.8312	2.108	-1.343	0.180	-6.971	1.309
Travel, Personal and Leisure	-2.7812	2.764	-1.006	0.315	-8.208	2.645
Utilities	-0.3848	1.992	-0.193	0.847	-4.296	3.526
Wholesale	-4.3347	2.146	-2.020	0.044	-8.548	-0.122
${f Field_Economy}$	-1.5748	1.521	-1.035	0.301	-4.562	1.412
${f Field_Enlargement}$	-1.1168	1.404	-0.795	0.427	-3.874	1.640
Field_Food safety	-1.1523	1.323	-0.871	0.384	-3.749	1.445
Field_Trans-European Networks	-1.9458	1.039	-1.872	0.062	-3.987	0.095
Field_Business and industry	0.1885	0.923	0.204	0.838	-1.624	2.002
Field_Agriculture and rural development	-3.2511	2.312	-1.406	0.160	-7.791	1.288
${f Field}_{f L}{f Youth}$	3.3991	1.689	2.013	0.045	0.083	6.715
Field_Migration and asylum	1.5984	2.705	0.591	0.555	-3.713	6.910
Field_Climate action	1.0998	1.027	1.071	0.285	-0.917	3.117
${f Field_Trade}$	2.0145	0.936	2.151	0.032	0.176	3.853
${f Field_Sport}$	-5.5419	3.191	-1.737	0.083	-11.808	0.724
Field_Borders and security	0.6399	1.329	0.481	0.630	-1.970	3.250

Field_Culture and media	1.6331	2.116	0.772	0.441	-2.522	5.788
Field_Humanitarian aid and civil protection	-1.9967	1.747	-1.143	0.253	-5.426	1.433
Field_Single market	0.2384	1.044	0.228	0.819	-1.812	2.288
Field_finance and the euro	-0.3703	1.112	-0.333	0.739	-2.554	1.813
Field_Education and training	-0.0639	1.132	-0.056	0.955	-2.287	2.159
Field_Fraud prevention	0.9089	1.309	0.694	0.488	-1.662	3.480
Field_Transport	6.9553	3.252	2.139	0.033	0.570	13.341
Field_Taxation	0.8264	0.945	0.875	0.382	-1.029	2.682
Field_Institutional affairs	1.6055	0.946	1.697	0.090	-0.252	3.463
Field_International co-operation and development	1.4334	0.976	1.468	0.142	-0.483	3.350
${f Field_Customs}$	-2.4967	0.991	-2.519	0.012	-4.443	-0.551
Field_External relations	-0.6357	1.000	-0.636	0.525	-2.599	1.328
Field_Banking and financial services	-0.5419	1.029	-0.527	0.599	-2.563	1.479
Field_Maritime affairs and fisheries	-1.6681	1.470	-1.135	0.257	-4.555	1.219
${f Field_Competition}$	-0.0653	1.001	-0.065	0.948	-2.032	1.901
Field_Energy	1.0151	0.981	1.035	0.301	-0.910	2.941
Field_Public health	-1.6129	1.087	-1.483	0.138	-3.748	0.522
${f Field_Environment}$	-0.7550	1.086	-0.695	0.487	-2.887	1.377
Field_Justice and fundamental rights	2.3068	1.064	2.168	0.030	0.218	4.396
${f Field_Culture}$	1.9489	2.196	0.888	0.375	-2.363	6.261
Field_Consumers	0.8574	0.947	0.906	0.366	-1.002	2.717
Field_Regional policy	0.4541	1.137	0.399	0.690	-1.779	2.687
Field_Research and innovation	-0.7756	0.903	-0.859	0.391	-2.549	0.997
Field_Digital economy and society	0.3175	1.210	0.262	0.793	-2.059	2.694
${f Field_Communication}$	-2.7628	1.106	-2.498	0.013	-4.934	-0.592
Field_European neighbourhood policy	-1.8741	1.871	-1.001	0.317	-5.549	1.800
${f Field_Budget}$	2.4074	1.163	2.070	0.039	0.124	4.691
Field_Employment and social affairs	0.4926	0.957	0.514	0.607	-1.387	2.373
Field_Foreign affairs and security policy	0.2850	1.102	0.259	0.796	-1.879	2.449

Omnibus:	530.602	Durbin-Watson:	1.973
Prob(Omnibus):	0.000	Jarque-Bera (JB):	12540.045
Skew:	2.957	Prob(JB):	0.00
Kurtosis:	22.381	Cond. No.	277.

^[1] Standard Errors assume that the covariance matrix of the errors is correctly specified.