

## **Execution Report**

Title: Smart Systemic-Risk Scores
Author: Sylvain Benoit

**Full reference:** Benoit, Sylvain (2018) "Smart Systemic-Risk Scores", Working paper (November 23, 2018).

The structure and contents of this execution report provided by **cascad** for the certification are similar to those recommended by the <u>AEA Data Editor</u>.

#### 1. DATA DESCRIPTION

The sample of systemic-risk indicators and categories used to support the findings of this study are public and manually collected from both several regulators' websites (<u>BIS</u> and <u>OFR</u>) and banks' websites. These raw data are available on the academic initiative <u>SIFI Watch</u>.

#### 2. CODE DESCRIPTION

For the purpose of this certification, we checked the results displayed in Tables 1 to 4 and Figures 1 to 11. Those results are computed using the following files:

#### **MATLAB files:**

- main code.m
- call\_fct.m
- call\_fct\_3Dplots.m
- RiskContributions.m
- riskCostFunction.m
- MyScatterPlot.m
- SIFIs\_sample\_14-17.mat (the database in Matlab format with systemic-risk categories and indicators expressed in basis points)

All code is written in Matlab, and was run with Matlab 2019b, on a 2-core Intel-based laptop with Windows 10.

## 3. REPLICATION STEPS

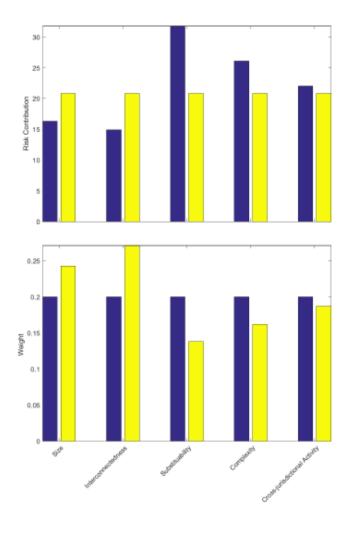
The resources were provided by the researcher on the cascad's website and were run as per readme. We encountered no issue during the reproduction.

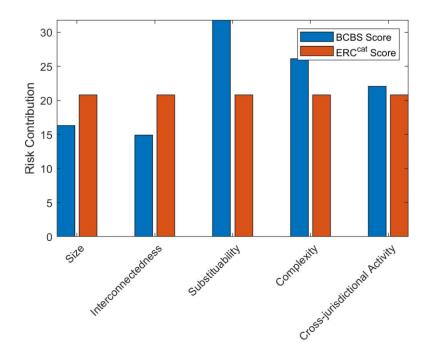
#### 4. FINDINGS

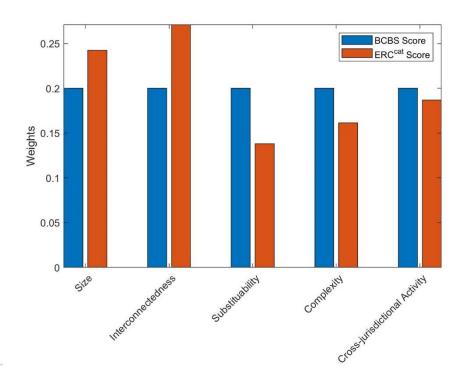
We reproduced the researcher's results with perfect accuracy.

# 4.1. FIGURE 2: RISK CONTRIBUTION AND WEIGHT FOR EACH SYSTEMIC-RISK CATEGORY (2017)

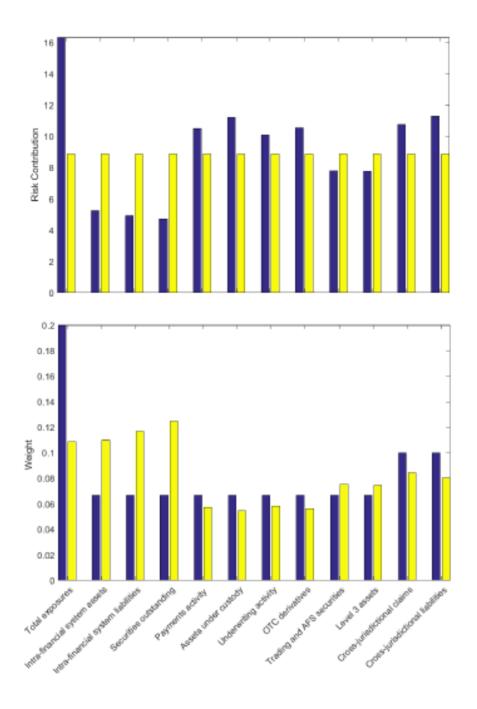
This figure reports on top the risk contribution and on the bottom the weight of the five systemic-risk categories used in the uncapped BCBS Score (dark blue bars) and in the ERCcat Score (yellow bars) for the year 2017.

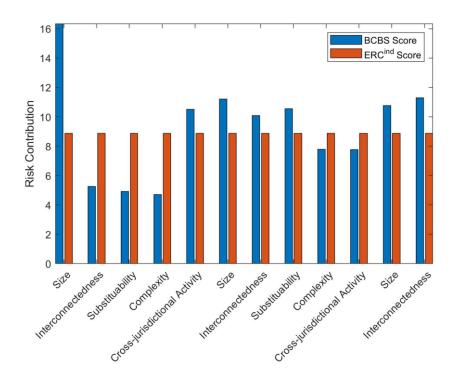


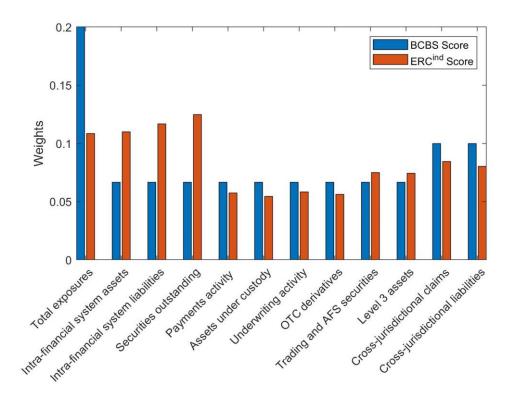




This figure reports on top the risk contribution and on the bottom the weight of the twelve systemic risk indicators used in the uncapped BCBS Score (dark blue bars) and in the ERC<sub>ind</sub> Score (yellow bars) for the year 2017.

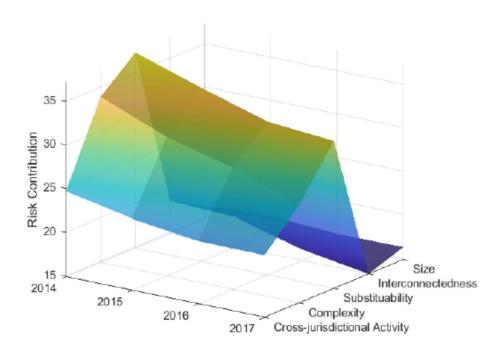


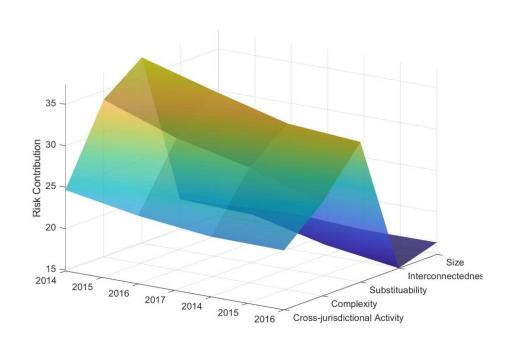




This figure reports the yearly evolution over time (from 2014 to 2017) of the risk contribution of the five systemic-risk categories with the current BCBS weights.

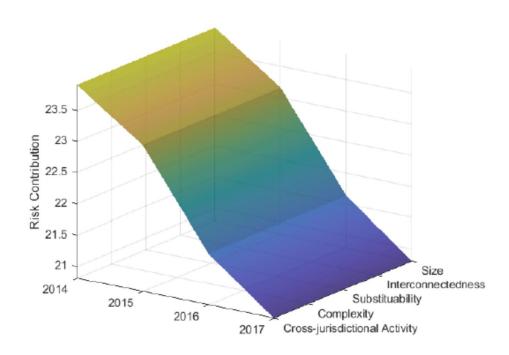
#### Original:

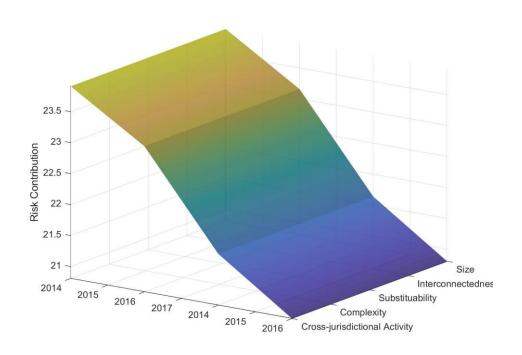




This figure reports the yearly evolution over time (from 2014 to 2017) of the risk contribution of the five systemic-risk categories when the ERC weights based on categories.

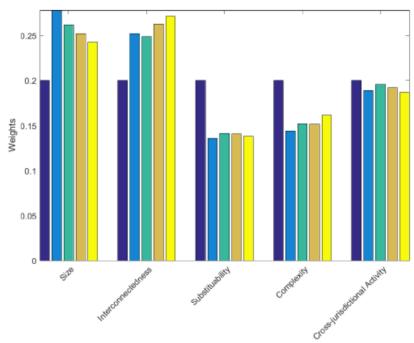
#### Original:

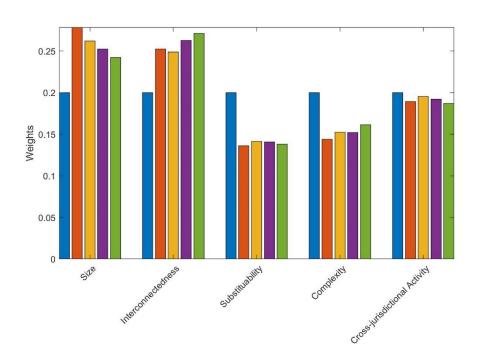




This figure reports the weights of each category used by the BCBS methodology (dark blue bars) to construct the systemic-risk score, and the ERC weights for the year 2014 (light blue bars), 2015 (green bars), 2016 (orange bars), and 2017 (yellow bars).

#### Original:

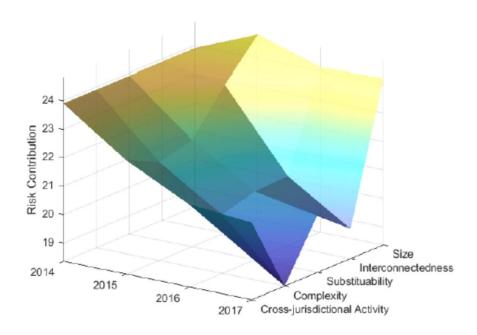


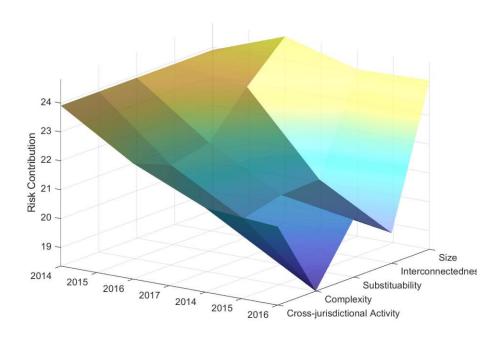


## 4.6. FIGURE 7: EVOLUTION OVER TIME OF THE RISK CONTRIBUTION FOR EACH SYSTEMIC-RISK CATEGORY WITH CONSTANT ERC WEIGHTS

This figure reports the yearly evolution over time (from 2014 to 2017) of the risk contribution of the five systemic-risk categories when the ERC weights based on categories remain constant over time. The ERC weights are set at the beginning of the period (2014).

#### Original:

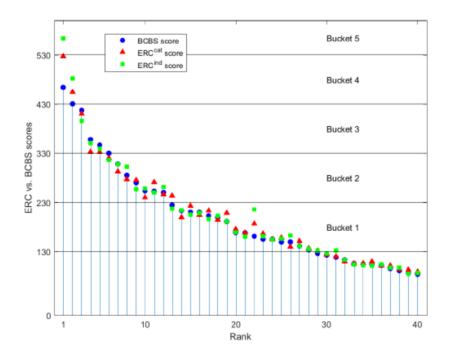


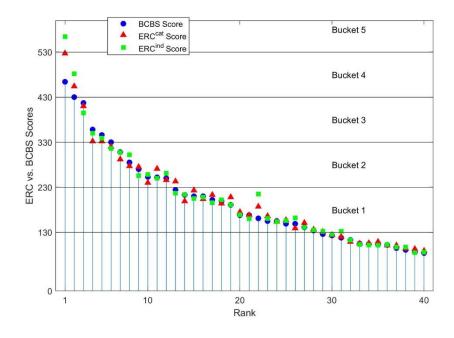


#### 4.7. FIGURE 8: SIFI RANKING BASED ON SMART SYSTEMIC-RISK (2016)

This figure displays the BCBS systemic-risk scores (blue circles) in descending order and the corresponding smart systemic-risk scores as of 2016 (red triangles for the equally-weighted risk contribution score based on categories and green square for the equally-weighted risk contribution score based on indicators). The horizontal lines denote the cut-off values used to allocate banks into systemic-risk buckets. Cut-off values are 130, 230, 330, 430, and 530.

#### Original:

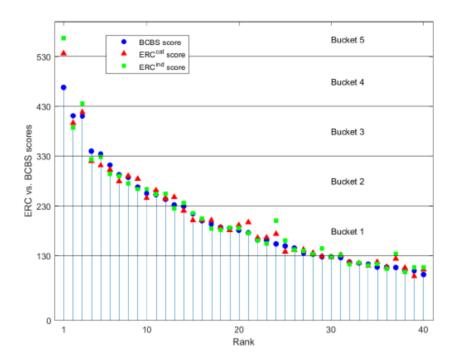


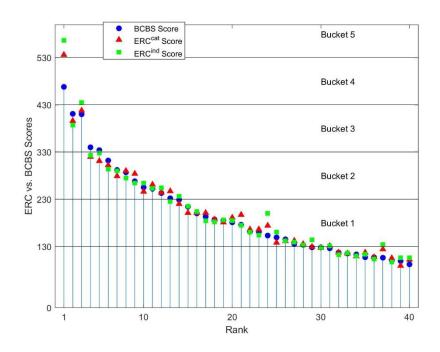


#### 4.8. FIGURE 9: SIFI RANKING BASED ON SMART SYSTEMIC-RISK (2017)

This figure displays the BCBS systemic-risk scores (blue circles) in descending order and the corresponding smart systemic-risk scores as of 2016 (red triangles for the equally-weighted risk contribution score based on categories and green square for the equally-weighted risk contribution score based on indicators). The horizontal lines denote the cut-off values used to allocate banks into systemic-risk buckets. Cut-off values are 130, 230, 330, 430, and 530.

#### Original:

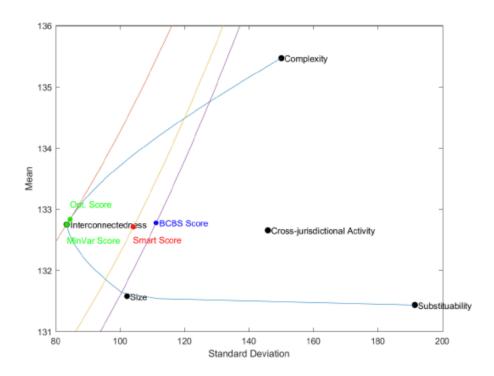


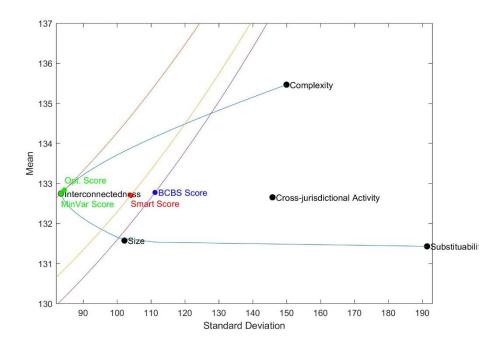


## 4.9. FIGURE 10: MEAN-VARIANCE REPRESENTATION OF SYSTEMIC-RISK SCORES BASED ON CATEGORIES (2017)

This figure displays the cross-sectional mean and standard deviation of the 4 systemic-risk scores (optimal, minimum-variance, uncapped BCBS, and smart based on categories) and of the 5 systemic-risk categories for the year 2017. Utility curves are also reported.

#### Original:

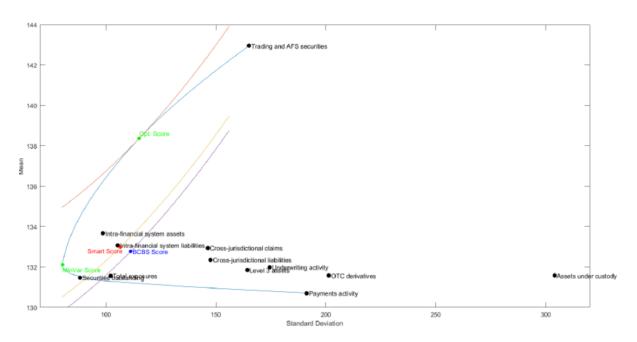


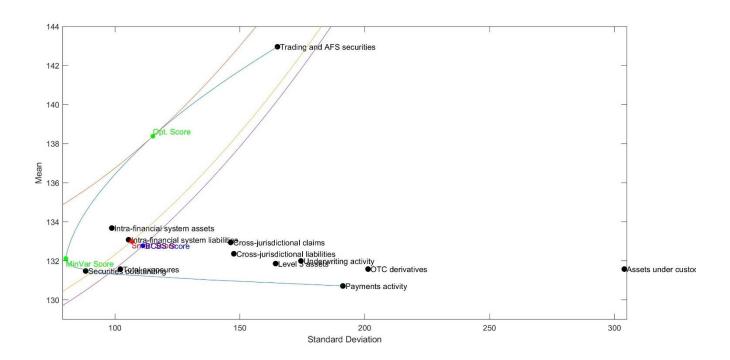


## 4.10. FIGURE 11: MEAN-VARIANCE REPRESENTATION OF SYSTEMIC-RISK SCORES BASED ON INDICATORS (2017)

This figure displays the cross-sectional mean and standard deviation of the 4 systemic-risk scores (optimal, minimum-variance, uncapped BCBS, and smart based on indicators) and of the 12 systemic-risk indicators for the year 2017. Utility curves are also reported.

#### Original:





#### 4.11. TABLE 1: SUMMARY STATISTICS (2016)

This table reports summary statistics expressed in basis points (except for skewness) on the 12 systemic risk indicators in Panel A, on the five systemic-risk categories plus the substitutability category capped at 5% in Panel B, and on the four systemic-risk scores (BCBS Scores uncapped and capped and the two smart systemic-risk scores) in Panel C.

Panel A: Systemic-risk indicators									
	Mean	Median	Std Dev.	Skewness	Minimum	Maximum			
1. Total exposures	131	94	103	1.5	32	463			
<ol><li>Intra-financial system assets</li></ol>	134	109	100	0.9	12	451			
<ol><li>Intra-financial system liabilities</li></ol>	133	104	102	0.8	2	415			
2c. Securities outstanding	131	113	91	1.2	10	425			
3a. Payments activity	130	60	210	3.5	0	1,160			
3b. Assets under custody	130	39	313	3.9	0	1,686			
3c. Underwriting activity	131	56	180	1.9	0	730			
4a. OTC derivatives	131	37	206	1.8	0	798			
4b. Trading and AFS securities	131	67	157	2.2	1	839			
4c. Level 3 assets	132	43	177	1.6	0	680			
<ol><li>Cross-jurisdictional claims</li></ol>	130	71	150	1.8	0	766			
<ol><li>Cross-jurisdictional liabilities</li></ol>	131	84	145	1.6	0	705			
Pa	nel B: S	ystemic-ri	sk categorie	28					
	Mean	Median	Std Dev.	Skewness	Minimum	Maximum			
1. Size	131	94	103	1.5	32	463			
2. Interconnectedness	133	106	87	0.9	13	401			
3. Substitutability	131	59	197	3.0	2	1,091			
<ol><li>Substitutability (cap=5%)</li></ol>	113	59	131	1.7	2	500			
4. Complexity	131	60	159	1.7	1	709			
<ol><li>Cross-jurisdictional activity</li></ol>	131	81	146	1.7	0	735			
1	Panel C:	Systemic-	risk scores						
	Mean	Median	Std Dev.	Skewness	Minimum	Maximum			
BCBS score (uncapped)	131	88	116	1.6	19	582			
BCBS score	128	88	107	1.3	19	464			
ERC <sup>cat</sup> score	131	93	108	1.4	23	527			
ERC <sup>ind</sup> score	132	91	112	1.6	21	563			

otal exposures'		131		94		103		1.5000	32		463	
Intra-financial system assets'			134		109		100		0.9000	12		451
Intra-financial system liabilitie	es'		133		104		102		0.8000	2		415
Securities outstanding' Payments activity '		131		113		91		1.2000	10		425	
		130		60		210		3.5000	0		1160	
Assets under custody'		130		39		313		3.9000	0		1686	
Underwriting activity'		131		56		180		1.9000	0		730	
OTC derivatives'		131		37		206		1.8000	0		798	
Trading and AFS securities'			131		67		157		2.2000	1		839
Level 3 assets'		132		43		177		1.6000	0		680	
Cross-jurisdictional claims'			130		71				1.8000	0		766
Cross-jurisdictional liabilities'			131		84				1.6000	0		705
'Size'		131		94		103		1.50	00	32		463
'Interconnectedness'		133		106		87		0.90	00	13		401
'Substituability'		131		59		197		3		2		1091
'Complexity'		131		60	159			1.7000		1		709
'Cross-jurisdictional Activit	y'	131		81		146		1.70	00	0		735
•												
'BCBS Score (uncapped)'	131		88		116		1.60	00	19		582	
'BCBS Score'	128		88		107		1.30	00	19		464	
'ERC^{cat} Score'	131		93		108		1.40	00	23		527	
'ERC^{ind} Score'	132		91		112		1.60	00	21		563	

#### 4.12. TABLE 2: SUMMARY STATISTICS (2017)

This table reports summary statistics expressed in basis points (except for skewness) on the 12 systemic risk indicators in Panel A, on the five systemic-risk categories plus the substitutability category capped at 5% in Panel B, and on the four systemic-risk scores (BCBS Scores uncapped and capped and the two smart systemic-risk scores) in Panel C.

Panel A: Systemic-risk indicators										
	Mean	Median	Std Dev.	Skewness	Minimum	Maximum				
1. Total exposures	132	94	102	1.6	32	466				
<ol><li>Intra-financial system assets</li></ol>	134	105	99	0.8	15	393				
<ol><li>Intra-financial system liabilities</li></ol>	133	104	105	0.8	1	430				
2c. Securities outstanding	131	111	88	1.3	11	426				
3a. Payments activity	131	66	191	3.3	0	1,199				
3b. Assets under custody	132	43	304	3.9	0	1,650				
3c. Underwriting activity	132	58	174	2.0	0	774				
4a. OTC derivatives	132	41	201	1.8	0	797				
4b. Trading and AFS securities	143	69	165	2.2	2	859				
4c. Level 3 assets	132	59	164	1.6	0	770				
<ol> <li>Cross-jurisdictional claims</li> </ol>	133	84	146	1.7	0	754				
5b. Cross-jurisdictional liabilities	132	81	148	1.8	0	771				
Pa	nel B: S	ystemic-ri	sk categorie	25						
	Mean	Median	Std Dev.	Skewness	Minimum	Maximum				
1. Size	132	94	102	1.6	32	466				
2. Interconnectedness	133	109	83	0.9	23	411				
3. Substitutability	131	63	191	3.0	2	1,103				
<ol><li>Substitutability (cap=5%)</li></ol>	115	63	132	1.8	2	500				
4. Complexity	135	61	150	1.5	5	654				
<ol><li>Cross-jurisdictional activity</li></ol>	133	86	146	1.8	0	763				
1	Panel C:	Systemic	risk scores							
	Mean	Median	Std Dev.	Skewness	Minimum	Maximum				
BCBS score (uncapped)	133	99	111	1.6	19	588				
BCBS score	130	99	103	1.3	19	467				
ERC <sup>cat</sup> score	133	103	104	1.4	21	536				
ERC <sup>ind</sup> score	133	104	107	1.5	18	567				

'Total exposures'		132		94		102		1.6000	1	32		466
Intra-financial system assets'				105		99		0.8000	)	15		393
Intra-financial system liabilities'				104		105		0.8000		1		430
'Securities outstanding'		131		111		88		1.3000	)	11		426
Payments activity '		131		66		191		3.3000	)	0		1199
'Assets under custody'		132		43		304		3.9000	1	0		1650
'Underwriting activity'		132		58		174		2		0		774
'OTC derivatives'		132		41		201		1.8000		0		797
'Trading and AFS securities'		143		69		165		2.2000	1	2		859
'Level 3 assets'		132		59	164		1.6000	)	0	770	770	
'Cross-jurisdictional claims'				84	84		146		1	0	7.5	754
Cross-jurisdictional liabilities'		132		81		148		1.8000	(	0		771
'Size'	132		94		102		1.60	000	32		46	6
'Interconnectedness'	133		109		83		0.90	000	23		41	1
'Substituability'	131		63	191		3		2			11	03
'Complexity'	135		61	61			1.5000		00 5		65	4
'Cross-jurisdictional Activity'	133		86		146		1.80	000	0		76	3
'BCBS Score (uncapped)'		133		99		111		1.6000		19		588
BCBS Score'		130		99		103		1.3000		19		467
'ERC^{cat} Score'		133		103		104		1.4000		21		536
'ERC^{ind} Score'		133		104		107		1.5000		18		567

This table reports the risk-bucket number with its respective Financial Stability Board (FSB) cut-off scores (Column 1), the additional capital requirement expressed as a percentage of risk-weighted assets (Column 2), the identity of the systemically important banks as identified by the FSB in descending order (Column 3), by the smart systemic-risk scores based on categories in descending order (Column 4), and based on indicators in descending order (Column 5) as of November 2016. The systemic-risk scores of all banks are reported in parentheses. A \* indicates that the substitutability category of the bank is capped at 5%, and the systemic-risk score without this cap is also reported in parentheses. A • indicates banks identified as SIFIs by supervisory judgement. The reported cut-off values are provided by the BCBS.

Bucket	Additional Capital	BCBS Score (30)	ERC <sup>cat</sup> Score (29)	ERC <sup>ind</sup> Score(30)
5 [530-629]	3.5%	Empty	Empty	JP Morgan Chase (564)
4 [430-529]	2.5%	JP Morgan Chase* (464/583) Citigroup* (430/495)	JP Morgan Chase (527) Citigroup (454)	Citigroup (482)
3 [330-429]	2.0%	HSBC (417) Deutsche Bank (358) Bank of America (346) BNP Paribas (330)	HSBC (410) Deutsche Bank (332) Bank of America (332)	HSBC (395) Deutsche Bank (350) Bank of America (339)
2 [230-329]	1.5%	Barclays (308) Credit Suisse (285) Mitsubishi UFJ FG (270) Goldman Sachs (253) ICBC (252) Wells Fargo (250)	BNP Paribas (320); Barclays (292) Credit Suisse (277); Mitsubishi UFJ FG (275) ICBC (271) Wells Fargo (246) Bank of China (243) Goldman Sachs (240)	BNP Paribas (316); Barclays (307) Credit Suisse (302) Wells Fargo (261) Goldman Sachs (258) Mitsubishi UFJ FG (256) ICBC (250)
1 [130-229]	1.0%	Bank of China (224) Morgan Stanley (213) China Construction Bank (210) Société Générale (210) Santander (202) UBS (199) Agricultural Bank of China (191) Groupe Crédit Agricole (168) Mizuho FG (168) Bank of New York Mellon* (161/227) Royal Bank of Scotland (155) Sumitomo Mitsui FG (155) Unicredit Group (149) State Street* (149/172) ING Bank (141) Standard Chartered (134) Groupe BPCE* (126) Nordea* (123)	China Construction Bank (223) Santander (213) Agricultural Bank of China (208) Société Générale (204) Morgan Stanley (199) UBS (194) Bank of New York Mellon (187) Groupe Crédit Agricole (175) Mizuho FG (168) Sumitomo Mitsui FG (166) Unicredit Group (157) Royal Bank of Scotland (154) ING Bank (151) State Street (139) Standard Chartered (136) Groupe BPCE (131)	Bank of China (217) Bank of New York Mellon (215) Morgan Stanley (214) Société Générale (208) China Construction Bank (205) UBS (202) Santander (196) Agricultural Bank of China (191) Groupe Crédit Agricole (169) State Street (162) Sumitomo Mitsui FG (161) Mizuho FG (160) Unicredit Group (156) Royal Bank of Scotland (154) ING Bank (141) Standard Chartered (135) Groupe BPCE (132) Industrial Bank (132)

BCBS Score			ERCcat Score		ERCind Score	
JP Morgan Chase	464	583	JP Morgan Chase	527	JP Morgan Chase	564
Citigroup	430	495	Citigroup	454	Citigroup	482
HSBC	417	417	HSBC	410	HSBC	395
Deutsche Bank	358	358	Deutsche Bank	332	Deutsche Bank	350
Bank of America	346	346	Bank of America	332	Bank of America	339
BNP Paribas	330	330	BNP Paribas	320	BNP Paribas	316
Barclays	308	308	Barclays	292	Barclays	307
Credit Suisse	285	285	Credit Suisse	277	Credit Suisse	302
Mitsubishi UFJ FG	270	270	Mitsubishi UFJ FG	275	Wells Fargo	261
Goldman Sachs	253	253	Industrial and Commercial Bank of China	271	Goldman Sachs	258
Industrial and Commercial Bank of Chin	252	252	Wells Fargo	246	Mitsubishi UFJ FG	256
Wells Fargo	250	250	Bank of China	243	Industrial and Commercial Bank of China	250
Bank of China	224	224	Goldman Sachs	240	Bank of China	217
Morgan Stanley	213	213	China Construction Bank	223	Bank of New York Mellon	215
China Construction Bank	210	210	Santander	213	Morgan Stanley	214
Sociéte Générale	210	210	Agricultural Bank of China	208	Sociéte Générale	208
Santander	202	202	Sociéte Générale	204	China Construction Bank	205
UBS	199	199	Morgan Stanley	199	UBS	202
Agricultural Bank of China	191	191	UBS	194	Santander	196
Groupe Crédit Agricole	168	168	Bank of New York Mellon	187	Agricultural Bank of China	191
Mizuho FG	168	168	Groupe Crédit Agricole	175	Groupe Crédit Agricole	169
Bank of New York Mellon	161	227	Mizuho FG	168	State Street	162
Sumitomo Mitsui FG	155	155	Sumitomo Mitsui FG	166	Sumitomo Mitsui FG	161
Royal Bank of Scotland	155	155	Unicredit	157	Mizuho FG	160
Unicredit	149	149	Royal Bank of Scotland	154	Unicredit	156
State Street	149	172	ING Bank	151	Royal Bank of Scotland	154
ING Bank	141	141	State Street	139	ING Bank	141
Standard Chartered	134	134	Standard Chartered	136	Standard Chartered	135
Groupe BPCE	126	126	Groupe BPCE	131	Industrial Bank	132
Nordea	123	123	Nordea	124	Groupe BPCE	132

#### 4.14. TABLE 4: LIST OF SYSTEMICALLY IMPORTANT FINNANCIAL INSTITUTIONS (2017)

This table reports the risk-bucket number with its respective Financial Stability Board (FSB) cut-off scores (Column 1), the additional capital requirement expressed as a percentage of risk-weighted assets (Column 2), the identity of the systemically important banks as identified by the FSB in descending order (Column 3), by the smart systemic-risk scores based on categories in descending order (Column 4), and based on indicators in descending order (Column 5) as of November 2016. The systemic-risk scores of all banks are reported in parentheses. A \* indicates that the substitutability category of the bank is capped at 5%, and the systemic-risk score without this cap is also reported in parentheses. A • indicates banks identified as SIFIs by supervisory judgement. The reported cut-off values are provided by the BCBS.

Bucket	Additional Capital	BCBS Score (30)	ERCent Score (29)	ERC <sup>ind</sup> Score(31)
5 [530-629]	3.5%	Empty	JP Morgan Chase (536)	JP Morgan Chase (567)
4 [430-529]	2.5%	JP Morgan Chase* (468/588)		Citigroup (435)
3 [330-429]	2.0%	HSBC (411) Citigroup* (410/452) Bank of America (340) Deutsche Bank (334)	Citigroup (418) HSBC (396)	HSBC (387)
2 [230-329]	1.5%	BNP Paribas (312) Barclays (292) Mitsubishi UFJ FG (287) ICBC (268) Goldman Sachs (255) China Construction Bank (252) Wells Fargo (243) Bank of China (232)	Bank of America (320); Deutsche Bank (311) BNP Paribas (302); Mitsubishi UFJ FG (290) ICBC (284) Barclays (279) China Construction Bank (261) Bank of China (247) Goldman Sachs (246) Wells Fargo (244)	Deutsche Bank (328); Bank of America (323) BNP Paribas (294); Barclays (290) Mitsubishi UFJ FG (275) ICBC (264) Goldman Sachs (264) Wells Fargo (254) China Construction Bank (253) Credit Suisse (236)
1 [130-229]	1.0%	Credit Suisse (229) Morgan Stanley (214) Société Générale (200) Santander (193) Mizuho FG (187) UBS (185) Sumitomo Mitsui FG (181) Agricultural Bank of China (176) Groupe Crédit Agricole (161) ING Bank (160) Bank of New York Mellon* (153/215) State Street* (149/171) Royal Bank of Canada (145) Unicredit Group (135) Standard Chartered (133) Royal Bank of Scotland* (128) Nordea* (115)	Credit Suisse (220) Morgan Stanley (201) Société Générale (201) Santander (201) Agricultural Bank of China (197) Sumitomo Mitsui FG (191) Mizuho FG (187) UBS (181) Bank of New York Mellon (174) Groupe Crédit Agricole (166) ING Bank (166) Unicredit Group (142) Royal Bank of Canada (141) State Street (138) Standard Chartered (135) Groupe BPCE (131)	Bank of China (225); Morgan Stanley (215) Société Générale (204) Bank of New York Mellon (200) UBS (186) Sumitomo Mitsui FG (185) Santander (184) Mizuho FG (182) Agricultural Bank of China (175) Groupe Crédit Agricole (160) State Street (160) ING Bank (154) Industrial Bank of Canada (142) Unicredit Group (139) China Minsheng Bank (134) Standard Chartered (133) Groupe BPCE (131)

BCBS Score		ERCcat Score		ERCind Score		
JP Morgan Chase	468	588	JP Morgan Chase	536	JP Morgan Chase	567
HSBC	411	411	Citigroup	418	Citigroup	435
Citigroup	410	452	HSBC	396	HSBC	387
Bank of America	340	340	Bank of America	320	Deutsche Bank	328
Deutsche Bank	334	334	Deutsche Bank	311	Bank of America	323
BNP Paribas	312	312	BNP Paribas	302	BNP Paribas	294
Barclays	292	292	Mitsubishi UFJ FG	290	Barclays	290
Mitsubishi UFJ FG	287	287	Industrial and Commercial Bank of China	284	Mitsubishi UFJ FG	275
Industrial and Commercial Bank of China	268	268	Barclays	279	Industrial and Commercial Bank of China	264
Goldman Sachs	255	255	China Construction Bank	261	Goldman Sachs	264
China Construction Bank	252	252	Bank of China	247	Wells Fargo	254
Wells Fargo	243	243	Goldman Sachs	246	China Construction Bank	253
Bank of China	232	232	Wells Fargo	244	Credit Suisse	236
Credit Suisse	229	229	Credit Suisse	220	Bank of China	225
Morgan Stanley	214	214	Sociéte Générale	201	Morgan Stanley	215
Sociéte Générale	200	200	Santander	201	Sociéte Générale	204
Santander	193	193	Morgan Stanley	201	Bank of New York Mellon	200
Mizuho FG	187	187	Agricultural Bank of China	197	UBS	186
UBS	185	185	Sumitomo Mitsui FG	191	Sumitomo Mitsui FG	185
Sumitomo Mitsui FG	181	181	Mizuho FG	187	Santander	184
Agricultural Bank of China	176	176	UBS	181	Mizuho FG	182
Groupe Crédit Agricole	161	161	Bank of New York Mellon	174	Agricultural Bank of China	175
ING Bank	160	160	Groupe Crédit Agricole	166	Groupe Crédit Agricole	160
Bank of New York Mellon	153	215	ING Bank	166	State Street	160
State Street	149	171	Unicredit	142	ING Bank	154
Royal Bank of Canada	145	145	Royal Bank of Canada	141	Industrial Bank	144
Unicredit	135	135	State Street	138	Royal Bank of Canada	142
Standard Chartered	133	133	Standard Chartered	135	Unicredit	139
Industrial Bank	128	128	Groupe BPCE	131	China Minsheng Bank	134
Royal Bank of Scotland	128	128	Industrial Bank	129	Standard Chartered	133
Groupe BPCE	126	126	Royal Bank of Scotland	127	Groupe BPCE	131
Toronto Dominion Canada Trust	117	117	China Minsheng Bank	124	Royal Bank of Scotland	128
Nordea	115	115	Toronto Dominion Canada Trust	117	Nordea	116