## MOODY'S

Better Faster Decisions

# What's New in RiskFrontier<sup>™</sup> and GCorr 2019 Update

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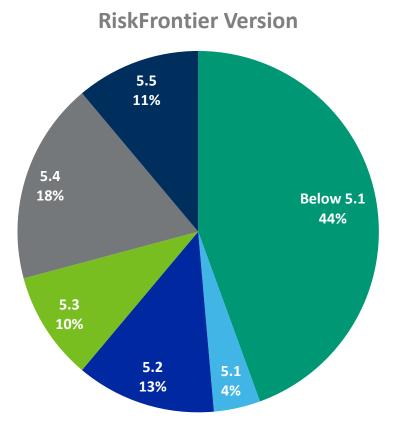
March, 2020

## Agenda

- 1. Features in Recent RiskFrontier Versions
- 2. Latest Features in 5.6
- 3. GCorr 2019 Highlights
- 4. Modeling Credit Risk Correlations using GCorr
- 5. Understanding and Implications of GCorr Corporate 2019
- 6. Validation of GCorr Corporate 2019
- 7. Understanding GCorr Sovereign 2019

#### **Current user versions**

More than half of users are using RiskFrontier 5.1 or above





## Features in Recent RiskFrontier Versions

### Recent RiskFrontier versions

Enhancements across usability, analytics, and technology



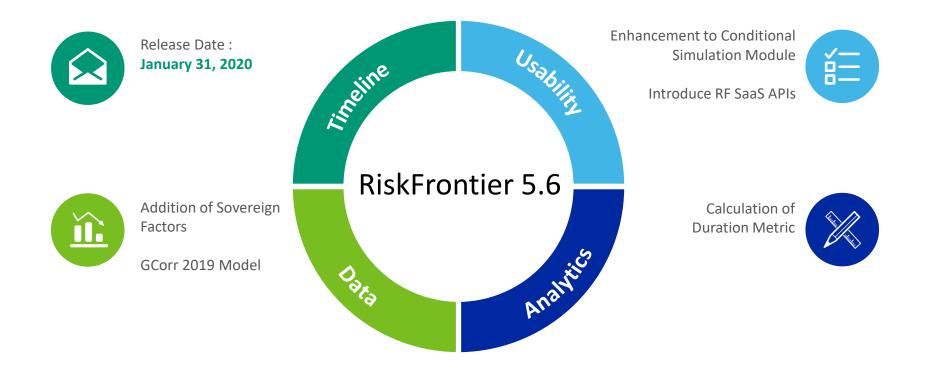
# RiskFrontier 5.4 (December 2018) and 5.5 (September 2019)

Usability	Analytics	Data
Functionality enhancements that ease use and help improve process efficiency	Valuation enhancement of CDO module for more intuitive and accurate outcomes and GCorr update	Increase asset class coverage
<ul> <li>CSV import feature supporting 46 commonly used tables (5.5)</li> <li>Account subscription information display on the RiskFrontier User Interface (5.5)</li> <li>Support custom correlation model with more than 200 macroeconomic variables (5.5)</li> <li>RiskFrontier On-Demand SaaS (5.5)</li> <li>Import performance for bond, loan, and lease instrument types has been improved (5.4)</li> </ul>	CDO valuation grid now considers the number of active collateral loans at analysis date as opposed to the number of collateral loans that mature beyond horizon, making valuation more accurate for CDO tranches that mature beyond horizon with one or more collateral loans that mature prior to horizon (5.4)	<ul> <li>GCorr 2018 Release (5.4)</li> <li>Corporate correlations</li> <li>Emerging Markets correlations</li> <li>US / Canada Retail Correlations</li> <li>US / Canada CRE Correlations</li> <li>Project Finance</li> <li>Macroeconomic Variables</li> </ul>



## Latest Features in RF 5.6

### **RiskFrontier 5.6 - Highlights**



### Usability: RF SaaS API

#### » Instance Management

Provides ability to Start and Stop the Core/DB Servers. Applicable to OnDemand setup only.

#### » Data Import

Provides ability to Import Portfolios in csv format. The below functionalities are part of the API

- Import CSV files only. For other file formats user will have to use UI
- Export Error Summary
- Check Import Status

#### » Run Analysis

#### Run Portfolio Analysis. The analysis & data settings have to be created on the UI

- Only Portfolio Analysis is supported with this release
- Export Error Summary
- Check Analysis Status

#### » Export Results

#### Export instrument level results is only available in this release

- Export Exposure Results with all columns included
- Other reports can be downloaded from the UI

## Usability: Enhancement to Conditional Simulation

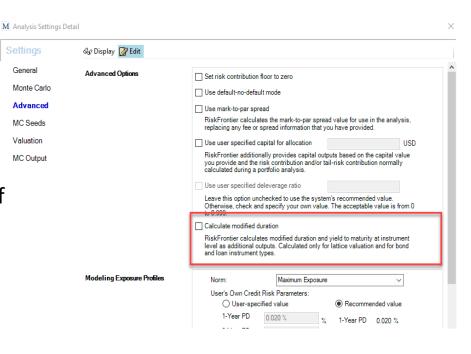
- » Prior versions of RiskFrontier required users to input return values when creating macroeconomic scenarios
- » New feature takes actual macro levels at horizon and analysis date as inputs for Macroeconomic Scenarios
- » Transformations and return calculations are handled by RiskFrontier based on the Macro variable

M Macroeconomic Scenario	×	Macroeconomic Scenario	
Scenario Name:		Scenario <u>N</u> ame:	
RF53 - Conditional Simulation		RF56 - Conditional Simulation	
Description:		De <u>s</u> cription:	
Select Correlation Model		Select Correlation Model	
GCORR 2018		GCORR 2019 V	
Select return frequency for Moody's Analytics correlation model		Select return frequency for Moody's Analytics correlation model	
O Quarterly O Annual		Quarterly  Annual	
Define a Macroeconomic Scenario		Define a Macroeconomic Scenario	
Add macroeconomic variables for the scenario and specify their returns over the selected scenario period. Note that for Moody's Analytics correlation models, inputs are in the form of log returns, as explained in the description field.		Add macroeconomic variables for the scenario and specify inputs as of analysis date and horizon. Refe RiskFrontier User Guide for input definition for each macroeconomic variables. Note that for Moody's A correlation models, inputs must be provided in decimals.	r to the nalytics
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Add     Edit     Delete       M Add Macro Variable	×	Add         Edit         Delete           M         Add Macro Variable         Image: Add Macro Variable	
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\*Note : RiskFrontier 5.3 and below will take inputs in the old format for conditional simulation.

### **Analytics: Duration Metric**

- » New feature to calculate modified duration for fixed and floating interest rate instruments
- » The option to calculate modified duration is available in the Analysis Setting
- » Generates Two Outputs
  - Yield to maturity
  - Modified Duration
- » Supported only for Lattice Valuation
- » Calculated only for the following types of instruments
  - Bonds
  - Term Loan Bullets
  - Term Loan Amortizing
  - Term Loan Amortizing Custom Cash Flow
  - Retail Loan
  - CRE Loan



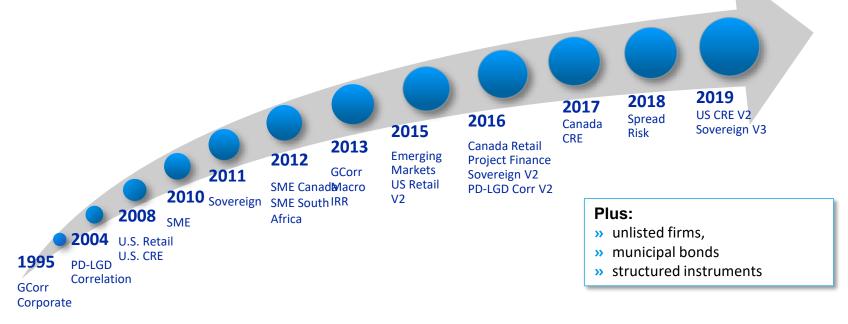
#### GCorr 2019 Data Update

Models Updated in GCorr 2019	Models made Compatible with GCorr 2019
GCorr Corporate	<ul> <li>GCorr CRE Canada</li> </ul>
<ul> <li>GCorr Emerging Markets</li> </ul>	<ul> <li>GCorr Retail US</li> </ul>
<ul> <li>GCorr CRE US</li> </ul>	<ul> <li>GCorr Retail Canada</li> </ul>
<ul> <li>GCorr Macro</li> </ul>	IRR Model
<ul> <li>GCorr Sovereign</li> </ul>	<ul> <li>Lambda Correlations</li> </ul>
	<ul> <li>PD-LGD Correlation</li> </ul>
	SME
	<ul> <li>Equity</li> </ul>
*Note: the dataset used for estimation of above 2019 models will include additional data points	



### GCorr 2019 Highlights

## Moody's Analytics Global Correlation (GCorr™) Model continues to expand



- » GCorr a multi-factor model of correlations among Issuers' asset returns
  - GCorr includes several asset classes: corporate (listed firms), CRE, retail, SMEs, sovereigns
  - Correlations for unlisted firms, municipal bonds and structured instruments can be also determined within GCorr
- GCorr Corporate a forward-looking multi-factor model of asset correlations among about 47,000 listed firms from over 70 countries and a wide range of industries

### GCorr 2019 Highlights

- » Models are updated using market information through March 31<sup>st</sup>, 2019
  - GCorr Corporate
    - > GCorr 2019 asset correlations are on average <u>slightly lower</u> globally than GCorr 2018 asset correlations.
    - > Results vary by region, sector, and size of firms. For example, asset correlations exhibit slightly increase across sectors in United States.
  - GCorr US CRE
    - > A methodology update by introducing linkage to local macroeconomic variables which allows for state-level stress testing
    - > A mild decrease in asset correlations compared to previous year
- » Sovereign model is updated with most current data, and a methodology update by introducing sovereign specific credit factors
- » Models that were made compatible with GCorr 2019: Retail, Canada CRE, SME and PD LGD model



## Modeling Credit Risk Correlations using GCorr

### How to think of correlations in credit risk?

- » Portfolio credit risk analysis has two parts:
  - Stand-alone credit risk of debt instruments in the portfolio
  - Correlations (or more generally a dependence structure) of changes in credit qualities of firms
- » One way to approximate correlations of credit quality changes is to use asset returns and their correlations (i.e. asset correlations).
- » An adequate correlation model should be able to quantify diversification and concentration effects within a credit portfolio.
  - → Moody's Analytics GCorr model (Global Correlation Model)

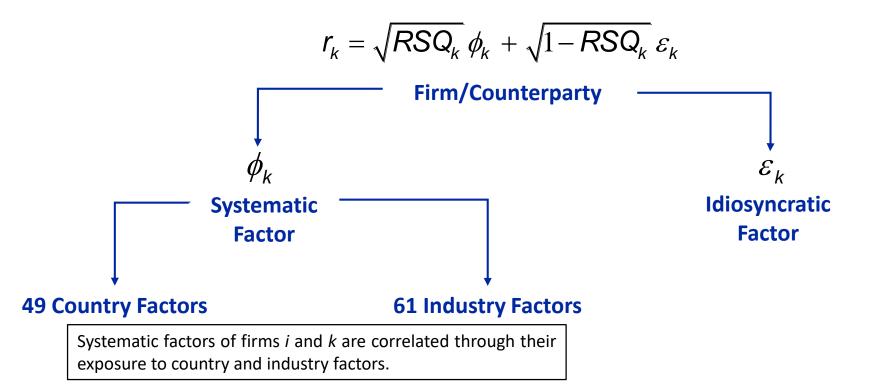
## Moody's Analytics Global Correlation (GCorr™) Model continues to expand

GCorr Model continue to expand in terms of both asset classes and global coverage, and number of factors in the model has more than doubled since 2010.

	GCorr 2010	GCorr 2011	GCorr 2012	GCorr 2013	GCorr 2014	GCorr 2015	GCorr 2016	GCorr 2017	GCorr 2018	GCorr 2019
Corporate	110	110	110	110	110	110	110	110	110	110
CRE – US	78	78	78	78	78	78	78	78	78	78
Retail – US	57	57	57	57	57	57	57	57	57	57
Macro	-	-	-	62	77	91	100	103	114	94
IRR	-	-	-	3	3	3	3	3	3	3
EM	-	-	-	-	161	161	161	161	161	161
Lambda	-	-	-	-	-	9	9	9	9	9
Local Macrovariables	-	-	-	-	-	102	138	156	156	156
Retail - Canada	-	-	-	-	-	-	24	24	24	24
CRE - Canada	-	-	-	-	-	-	-	23	23	23
Sovereign	-	-		_	_	_	_	-	_	133
Total Factors	245	245	245	310	486	611	680	724	735	848

Increase of number of GCorr factors

#### GCorr 2019 Corporate factor structure



» Given the model assumptions, the asset correlation between firms *i* and *k* is:

$$corr(r_i, r_k) = \sqrt{RSQ_i} \sqrt{RSQ_k} corr(\phi_i, \phi_k) \Box_{i}^{\wedge}$$

In this factor model, asset correlations are given by two sets of inputs: R-squareds and custom index correlations.

# GCorr Corporate is updated and expanded annually

- » GCorr 2019 Corporate includes the dynamics of the most recent available weekly asset returns.
  - Data used for R-squared estimation a three-year window: <u>April 2016 – March</u> <u>2019</u>

GCorr 2018 Corporate: April 2015 – March 2018

Data used for estimation of systematic factor correlations: <u>July 1999 – March</u>
 <u>2019</u>

GCorr 2018 Corporate: July 1999 – March 2018



## Slightly higher empirical asset correlation

Empirical asset correlation in April 2016 – March 2019 window is slightly higher than the asset correlation in April 2015 – March 2018 window

#### North America financial (820 Firms)

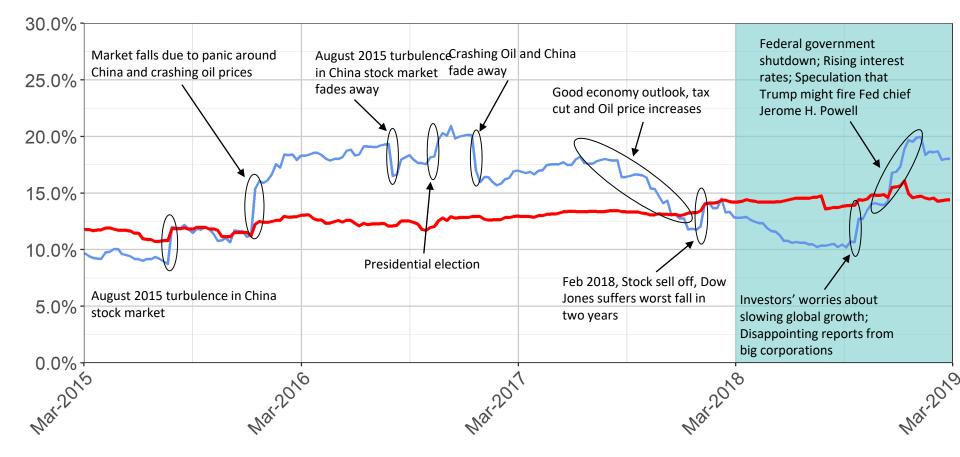


— 1 Year — 3 Year

#### **North American Financials**

#### North America financial (820 Firms)

-1 Year-3 Year



### Lower empirical asset correlation

Asia financial (544 Firms)

Empirical asset correlation in April 2016 – March 2019 window is lower than the asset correlation in April 2015 – March 2018 window

40.0% 35.0% 30.0% 25.0% 20.0% 15.0% 10.0% 5.0% 0.0%-Nar2002 Nar2003 Nar2004 Nar2005 Nar2005 Nar2005 Nar2005 Nar2005 Nar2010 Nar2010 Nar2010 Nar2015 Nar2015 Nar2015 Nar2015 Nar2015 Nar2015

— 1 Year — 3 Year

### Asia Financials

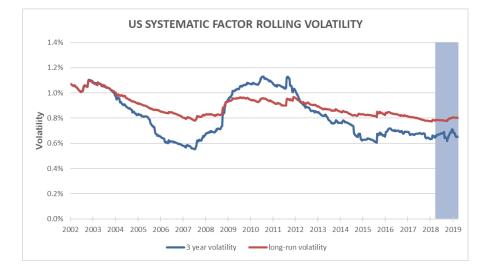
#### Asia financial (544 Firms)

30.0% August 2015 turbulence in China stock market fades away Market falls due to panic 25.0% around China and crashing oil prices 20.0% Stocks rises due to the signs Crashing Oil and China of easing U.S.-China trade fade away tensions 15.0% U.S. market meltdown in Feb 2018 was spreading across Asia 10.0% 5.0% 0.0%+ Mar.2015 Marilono Mar.2018 Mar-2017 Mar.2019

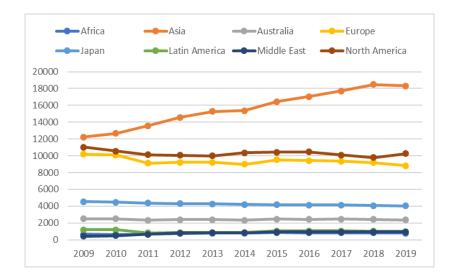
-1 Year-3 Year

# Short run volatility is below the long run volatility

- » Potential increase in volatility levels in next few years:
  - Volatility calculated over April 2016 March 2019 window is lower than volatility over July 1999 – March 2019 window. If we expect volatility to be mean-reverting, then three-year rolling volatility can potentially increase in next couple of years.

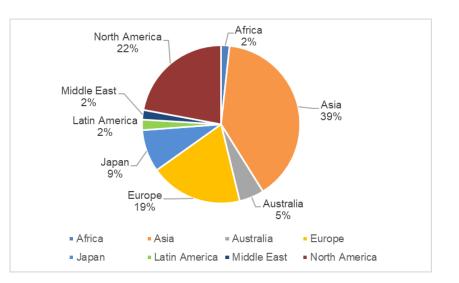


## GCorr 2019 covers many firms from Asia, North America, and Europe



Number of Firms by Region

#### **Regional Coverage in GCorr 2019**





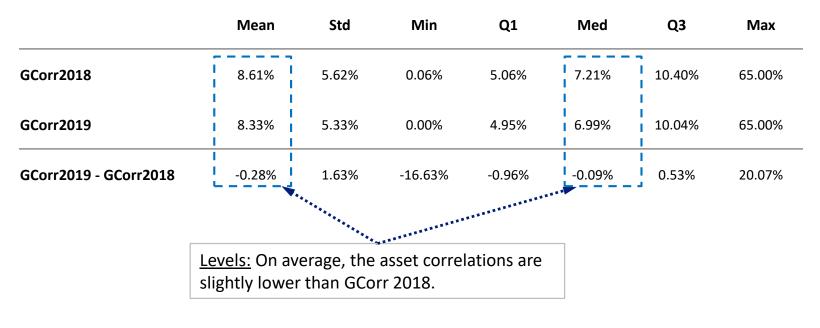
Understanding and Implications of GCorr 2019 Corporate

### **Key Findings**

- » GCorr 2019 asset correlations are on average <u>slightly lower</u> than GCorr 2018 asset correlations.
- » GCorr asset correlations are impacted by:
  - » Factor correlations: flat
  - » R-squared values: slightly decrease
- » Results vary by region, sector, and size of firms

## Overall, GCorr asset correlations are slightly lower than the previous model

#### **Global Random 5000 Firms: GCorr Asset Correlations**



\* Row "Differences" provides statistics for <u>pair-wise</u> differences between GCorr 2019 and GCorr 2018 correlations. Thus, it is not determined by subtracting statistics in the first row from those in the second row.

## Overall, GCorr factor correlations are unchanged and RSQs are slightly lower

#### **Global Random 5000 Firms: GCorr Factor Correlations**

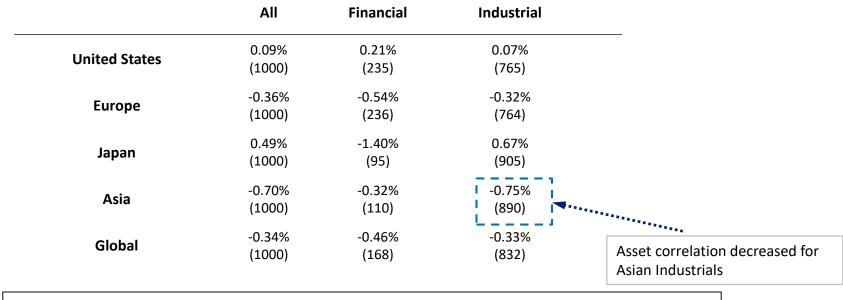
	Mean	Std	Min	Q1	Med	Q3	Max
GCorr2018	43.8%	17.4%	0.2%	31.8%	40.9%	52.3%	100.0%
GCorr2019	43.8%	17.4%	0.0%	31.7%	40.8%	52.2%	100.0%
GCorr2019 - GCorr2018	0.0%	2.1%	-50.4%	-0.4%	0.0%	0.4%	50.8%

#### **Global Random 5000 Firms: GCorr RSQ**

	Mean	Std	Min	Q1	Med	Q3	Max
			10.00/	10.00/		20.2%	65.00/
GCorr2018	21.7%	14.1%	10.0%	10.0%	15.5%	30.2%	65.0%
GCorr2019	20.9%	13.3%	10.0%	10.0%	15.0%	29.0%	65.0%
GCorr2019 - GCorr201	<b>8</b> -0.8%	5.0%	-10.0%	-3.4%	0.0%	1.1%	10.0%

## Asset correlation changes in different regions and sectors

#### Random 1000 Firms in Different Regions: Average GCorr Asset Correlation Change



Asset correlations exhibit slightly increase across sectors in United States while decreasing across sectors in Asia.

## Factor correlation and R-squared value changes in different regions

#### Random 1000 Firms in Different Regions: Average Factor Correlation Change

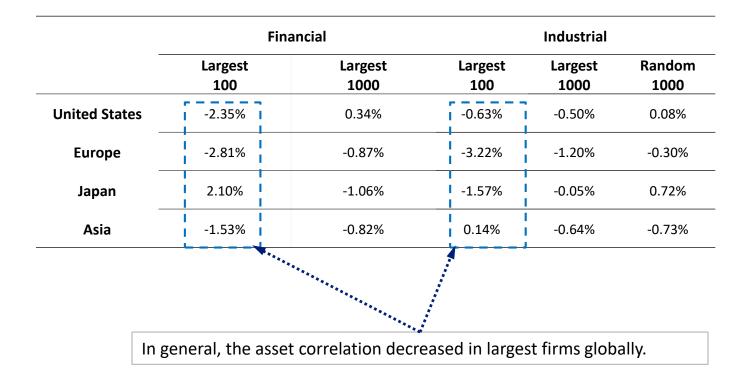
Random 1000 Firms in Different Regions: Average R-Squared Change

	All	Financial	Industrial		All	Financial	Industrial
nited States	0.52% (1000)	-0.11% (235)	0.75% (765)	United States	-0.05% (1000)	0.19% (235)	-0.12% (765)
Europe	-0.12% (1000)	-0.32% (236)	-0.03% (764)	Europe	-0.73% (1000)	-0.90% (236)	-0.68% (764)
Japan	-0.20% (1000)	-0.14% (95)	-0.20% (905)	Japan	0.55% (1000)	-1.25% (95)	0.74% (905)
Asia	-0.18% (1000)	-0.07% (110)	-0.18% (890)	Asia	-1.50% (1000)	-0.49% (110)	-1.62% (890)
Global	-0.03% (1000)	-0.02% (168)	-0.03% (832)	Global	-0.92% (1000)	-0.94% (168)	-0.92% (832)
				**************************************			

Asset correlation change in Asian Industrials is mostly driven by R-squared changes

### GCorr asset correlation changes vary by size

#### **Average Asset Correlation Change by Size (Largest versus Random)**



### Impact on portfolio statistics

Region	Portfolio	Number of Firms	R-squared Change	Asset Correlation Change	Unexpected Loss Change	Economic Capital Change
Global	Non-Financials	30,627	-0.8%	-0.3%	-1.2%	-1.9%
	Non-Financials, EDF < 100 bps	18,247	-0.5%	-0.2%	-1.4%	-1.8%
	Financials	6,018	-1.0%	-0.5%	-2.4%	-3.9%
	Financials, Assets > \$25 billion	629	-1.9%	-1.3%	-3.3%	-2.7%
US	Non-Financials	3,699	-0.2%	-0.1%	-0.8%	-1.1%
	Non-Financials, EDF < 100 bps	2,128	0.1%	0.1%	0.8%	4.6%
	Financials	1,243	0.0%	-0.1%	-0.3%	0.0%
	Financials, Assets > \$25 billion	120	-1.8%	-1.9%	-2.4%	-3.4%
Europe	Non-Financials	4,975	-0.6%	-0.3%	-1.2%	-1.8%
	Non-Financials, EDF < 100 bps	3,382	-0.7%	-0.3%	-1.4%	-2.5%
	Financials	1,459	-1.0%	-0.6%	-2.9%	-4.4%
	Financials, Assets > \$25 billion	155	-3.3%	-2.5%	-4.9%	-12.9%
Asia/Australia	Non-Financials	19,216	-1.0%	-0.4%	-1.0%	-2.5%
	Non-Financials, EDF < 100 bps	11,335	-0.5%	-0.2%	-1.7%	-2.4%
	Financials	2,388	-1.2%	-0.6%	-2.9%	-5.8%
	Financials, Assets > \$25 billion	274	-1.0%	-0.6%	-0.4%	0.0%

In general, directional change of unexpected loss and capital will be in line with asset correlation change.

In general, portfolios of large financial firms exhibit higher decrease in asset correlation, unexpected loss and capital than the others.



## Validation of GCorr Corporate 2019

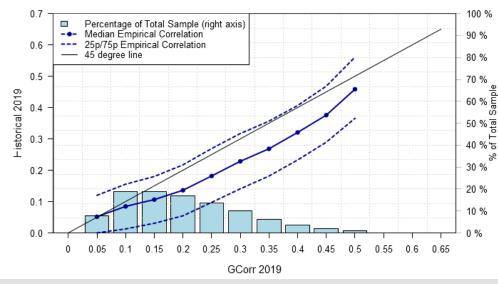
### Validation of GCorr Corporate

- » In-sample validation of GCorr 2019 Corporate
  - Comparing GCorr 2019 asset correlation level to 3-year historical asset correlations.

- » Out-of-sample validation
  - Comparing forward-looking R-squared to out-of-sample empirical R-squared.

## Comparison of forward-looking GCorr correlations and historical correlations

- Asset correlations and R-squared values produced by GCorr 2019 Corporate are higher than the empirical levels over April 2016 – March 2019:
  - Recent volatilities are low compared to the long-run average, so GCorr predicts future correlations to be slightly higher than what we observe historically

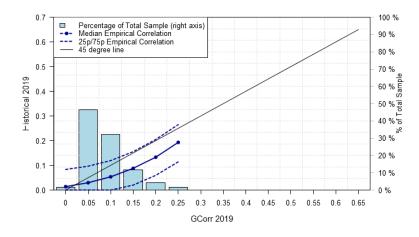


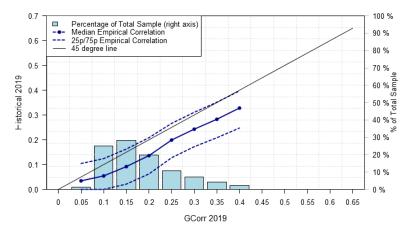
#### 1,000 Largest firms Median empirical correlation per a GCorr correlation bucket

### Median analysis for various regions

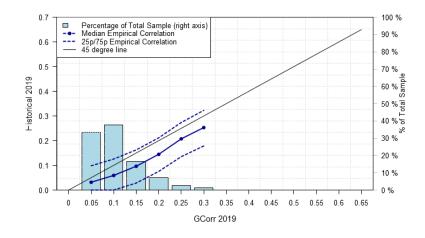
#### 1000 Random – Global



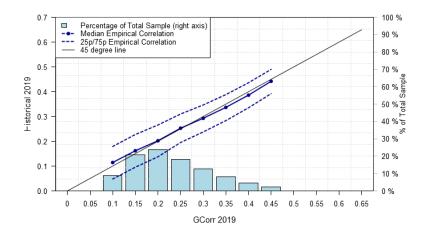




#### 1000 Random – Europe

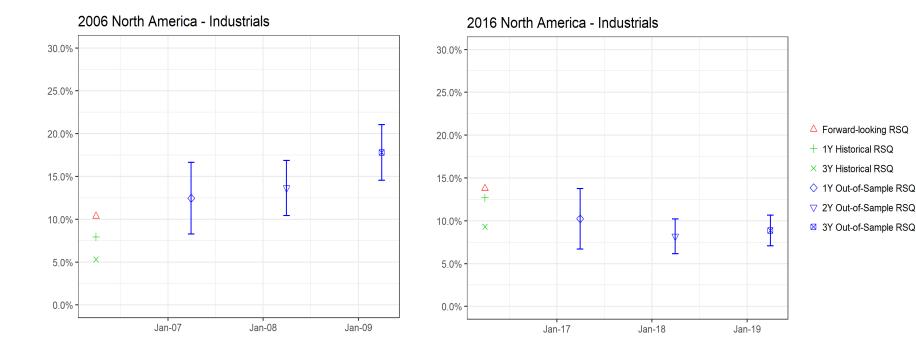


#### 1000 Random – Japan



## **Out-of-sample RSQ Prediction**

The forward-looking RSQ accurately predicted that level of RSQ would be higher in the future compared to the historical one-year and three-year RSQ



## Additional validation of GCorr Corporate

- » Asset correlations implied by empirical default rates
  - Research paper by Moody's Analytics Asset Correlation, Realized Default Correlation, and Portfolio Credit Risk.
  - GCorr asset correlations were generally higher than the default implied asset correlations.
- » Correlations as an input of a portfolio credit risk model
  - Research paper by Moody's Analytics Navigating Through Crisis: Validating RiskFrontier<sup>®</sup> Using Portfolio Selection
  - Using GCorr Corporate correlations results in ex-ante Unexpected Losses which perform better in identifying more and less risky portfolios than alternative correlation measures, such as empirical asset correlations.
  - Portfolio losses estimated using ratings-based PDs and Basel II correlations result in a less conservative view of economic capital than parameterization using public EDF and GCorr measures

## Summary of GCorr 2019 Corporate

- » Trends in asset correlations:
  - Empirical asset correlations are lower than last year's level for most of the regions and sectors.
- » Main features of GCorr 2019 Corporate:
  - GCorr 2019 asset correlations are lower than GCorr 2018
    - » Factor correlations: flat
    - » R-squared values: slightly decrease
- » Prediction by GCorr 2019 Corporate:
  - We predict next year's empirical correlations to be higher than this year's



## Understanding GCorr Sovereign 2019

## Key Takeaways

GCorr Sovereign – a **multi-factor model** to measure **credit correlations** of sovereigns in the context of a credit portfolio risk analysis. It is linked to factors of other asset classes.

GCorr Sovereign 2019 uses CDS data up to March 2019 to model the correlations.

- » The CDS spreads come from the CMA database.
- » The model covers **132** sovereigns.

#### What has happened to sovereign correlations in recent years?

- » Higher levels of correlations during the financial and eurozone crises.
- » Generally, correlations at a lower level in the past 5 years.
- In the absence of a global shock in recent years, sovereign risk has become more linked to specific issues of individual countries:
  - political instability, commodities slump, reliance on foreign-currency denominated debt.

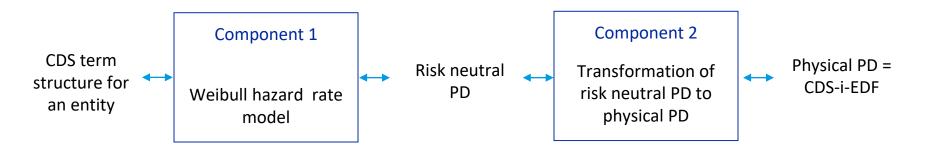
#### Data & modeling enhancements in GCorr Sovereign 2019

- » Refinement of the factor structure to accommodate new empirical patterns.
- » Move to the CMA database & new liquidity filtering of the CDS data.

## From CDS spreads to credit correlations

**Spread correlation** is not a good measure of credit quality correlation because spreads are driven, among others, by risk-premium dynamics.

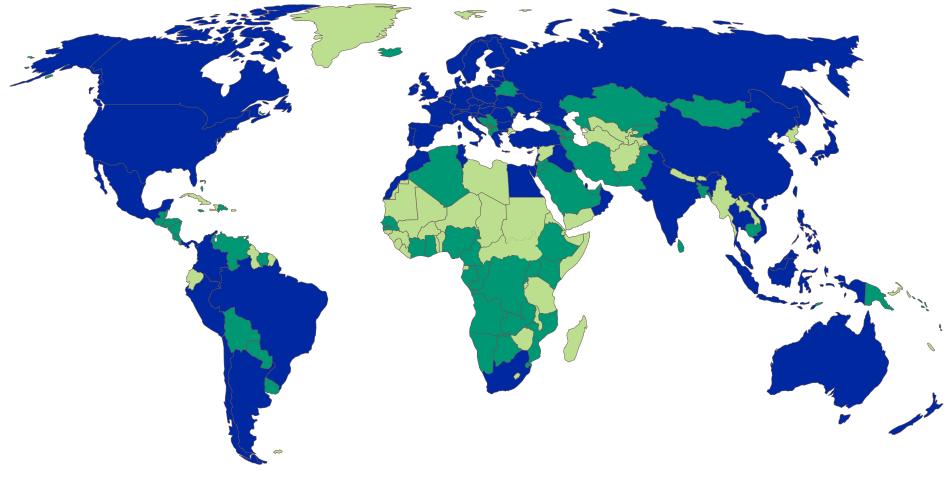
Instead, we consider **Moody's CDS-i-EDF** as a purer measure of sovereign's credit risk dynamics (Physical Probability of Default):



To make the CDS-i-EDF series stationary, we convert them to Distance-to-default (DD), by taking  $DD = -N^{-1}(CDS-i-EDF)$ .

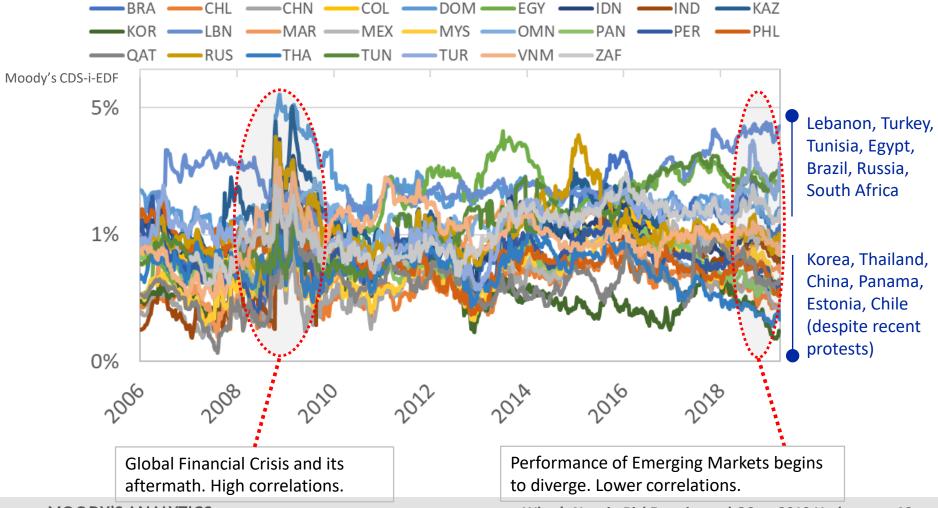
**Credit correlations for sovereigns** – correlations of DD changes for a pair of sovereigns:  $corr(\Delta DD_i, \Delta DD_j)$ 

### **Countries covered in GCorr Sovereign 2019**



62 countries with CDS spread data and covered in GCorr Sovereign 2019
 70 countries without CDS spread data but covered in GCorr Sovereign 2019
 countries not covered in GCorr Sovereign 2019

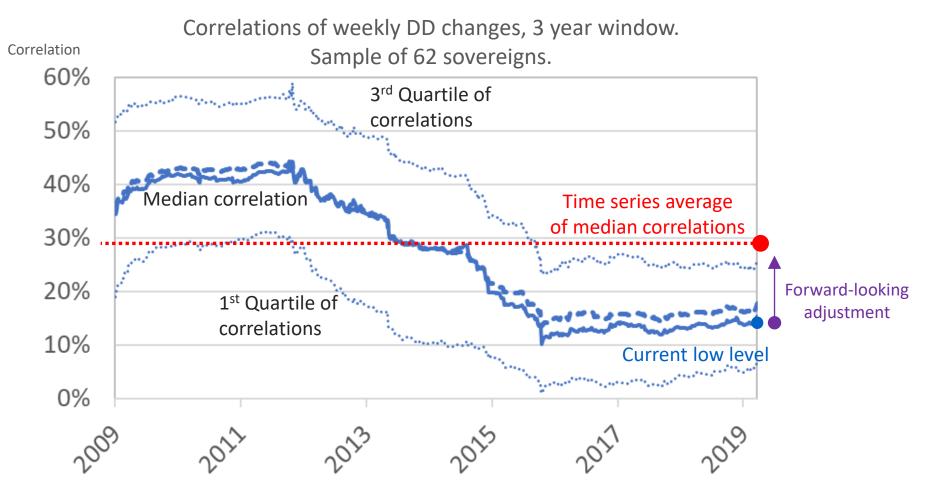
# Risks of Emerging Markets seemed to have diverged



MOODY'S ANALYTICS

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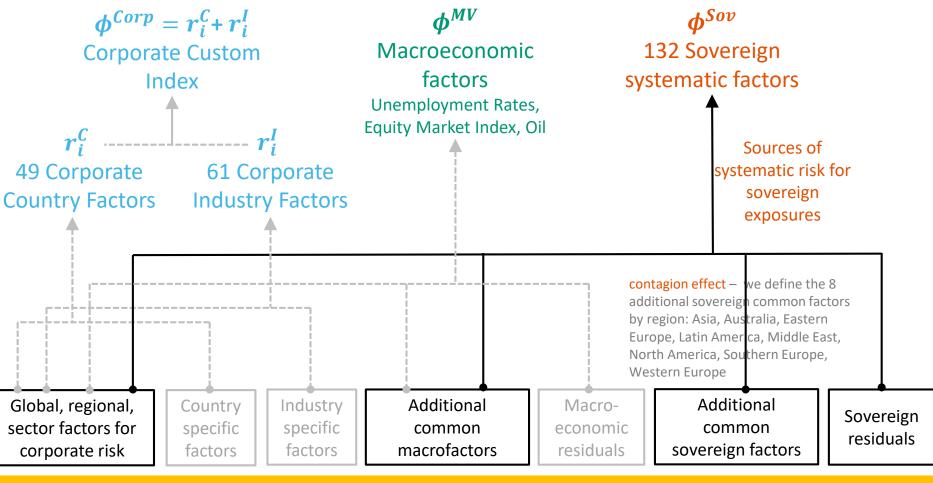
## Forward-looking correlations?



#### Why consider forward-looking adjustment?

The model should not reproduce only the recent correlation level, but also consider the possibility that correlations may rise if the global economy undergoes a shock affecting many sovereigns at once.

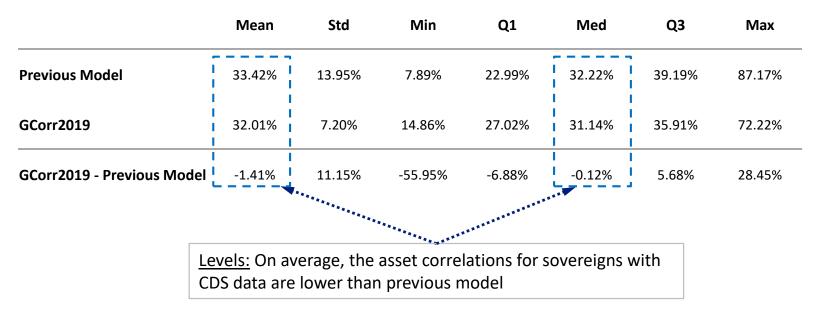
## Introducing sovereign factors into the GCorr factor structure



#### **Common orthogonal factors**

## Overall, sovereign asset correlations are lower than the previous model

#### 62 Sovereigns with CDS data: GCorr Asset Correlations



\* Row "Differences" provides statistics for <u>pair-wise</u> differences between GCorr 2019 and previous model correlations. Thus, it is not determined by subtracting statistics in the first row from those in the second row.

## Asset correlation changes in different regions and markets

#### **62** Sovereigns in Different Regions: **Average GCorr Asset Correlation Change**

	All Emerging Markets		<b>Developed Countries</b>		
Americas	-6.12%	-14.87%	3.28%		
Asia/Australia	-8.28%	-16.37%	0.23% -3.15%		
Europe	-3.01%	-5.46%			
Middle East and Africa	0.26%	0.26%	N/A		
Global	-1.41%	-3.46%	-0.93%		
		*********			
In general, asset correlations ex	hibit decrease	in emerging markets	across regions.		

bit decrease in enierging markets aci

\* "N/A" means none of 62 sovereigns in Middle East and Africa is assigned to developed countries.

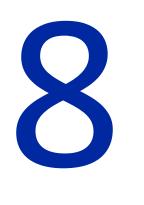
## Patterns in sovereign asset correlations by geographical areas

#### 62 Sovereigns in Different Regions: Average GCorr 2019 Asset Correlation

	Asia	Australia	Eastern Europe	Western Europe	Latin America	Middle East & Africa	North America	Southern Europe
Asia	38.7%	32.3%	31.0%	29.6%	38.4%	30.2%	26.9%	29.0%
Australia	32.3%	34.6%	29.3%	30.6%	34.0%	28.9%	28.3%	29.1%
Eastern Europe	31.0%	29.3%	39.4%	31.1%	32.8%	29.7%	27.1%	30.9%
Western Europe	29.6%	30.6%	31.1%	36.2%	31.5%	29.2%	31.2%	34.7%
Latin America	38.4%	34.0%	32.8%	31.5%	48.2%	32.4%	32.7%	29.7%
Middle East & Africa	30.2%	28.9%	29.7%	29.2%	32.4%	33.6%	26.8%	27.8%
North America	26.9%	28.3%	27.1%	31.2%	32.7%	26.8%	35.0%	28.7%
Southern Europe	29.0%	29.1%	30.9%	34.7%	29.7%	27.8%	28.7%	35.9%

## Summary of GCorr Sovereign 2019

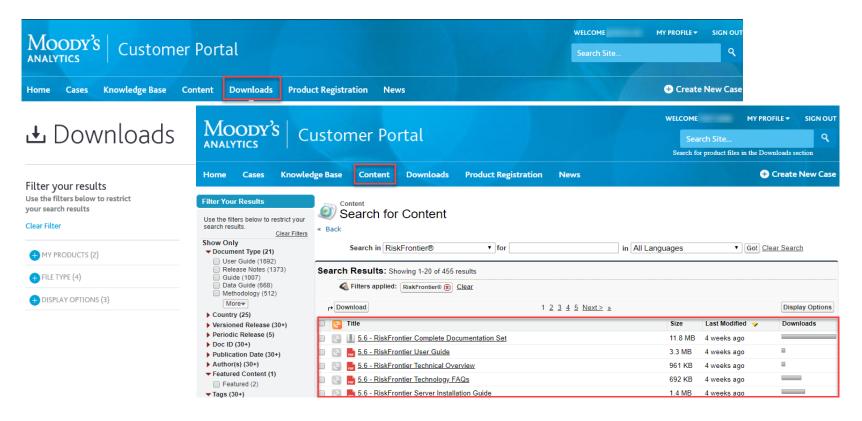
- » Trends in asset correlations:
  - Generally, correlations at a lower level in the past 5 years.
  - In the absence of a global shock in recent years, sovereign risk has become more linked to specific issues of individual countries.
  - Empirical asset correlations are more diverse across sovereigns in recent years than in previous time periods.
- » Main features of GCorr Sovereign 2019:
  - GCorr 2019 uses data up to March 2019 and covers 132 sovereigns.
  - GCorr 2019 asset correlations are lower than GCorr 2018 on the average level.
  - Correlations of countries within the same region are stronger than correlations of countries in different regions.



### **Next Steps**

## Visit Customer Portal

- » Tell your colleagues about the latest RiskFrontier version 5.6
- » Check out Moody's Analytics Customer Portal
  - Download installation files and standard product documentation



## Support and Additional Resources

- » For ongoing day-to-day all product related questions, MA's client support team via:
  - Email: <u>MA\_support@moodys.com</u>
  - Phone: +1 212 553 1653
  - Customer Support Web: <u>http://moodysanalytics.com/support</u>
- » RiskFrontier Methodology Document: "Modeling Credit Portfolios"
- » RiskFrontier product documents can be downloaded via the Customer Support Web.
- » Future RiskFrontier education via trainings and seminars conducted by Moody's:
  - RiskFrontier Methodology and Business Use Training (2 days)
  - Credit Portfolio Models and Validation (2 days)
  - New Research in Portfolio Modeling (1 day)
- » Moody's Conferences to interact with other MA clients of RiskFrontier:
  - Portfolio User Group
  - MA Summit

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#### Better Faster Decisions



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