

# New Credit Risk Analytics and Applications

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**( November 2013 )**

# Outline

- An alternative to the “sell-side” credit rating business model
- Generic elements required of an ideal credit risk analytics platform
- A new bottom-up corporate credit analytics platform
- Single-obligor analysis and credit portfolio analytics

## An Alternative Way

- The business model of the **sell-side** credit rating industry has been severely criticized for its role in causing the 2008-09 financial crisis.
- Regulators have been trying to address the problems associated with the **issuer-pay** business model. The results are predictably disappointing, however; for example, see what the US **Dodd-Frank Act** has accomplished.

## An Alternative Way (continued)

- The US **Dodd-Frank Act** (July 2010) mandates the responsible US federal agencies to remove regulatory references to commercial credit ratings.
- According to the notice of final rule making released by the Fed, FDIC and OCC (June 2012) and starting from January 1, 2013, the regulatory capital for a US bank's sovereign bondholding is assessed using the **OECD Country Risk Classification** (0 being the best and 7 the worst).

# An Alternative Way (continued)

As of Jan 1, 2013

	Country Code ISO Alpha 3	Country Name <sup>(1)</sup>	Classification		Notes
			Previous	Current Prevailing	
1	AFG	Afghanistan	7	7	
25	BRA	Brazil	3	3	
37	CHN	China	2	2	
38	TWN	Chinese Taipei	1	1	
68	DEU	Germany	0	-	(5) (6)
70	GRC	Greece	0	-	(5) (6)
78	HKG	Hong Kong, China	1	1	
80	ISL	Iceland	0	-	(5)
81	IND	India	3	3	
85	IRL	Ireland	0	-	(5) (6)
87	ITA	Italy	0	-	(5) (6)
89	JPN	Japan	0	-	(5)
94	KOR	Korea	0	-	(5)
145	PRT	Portugal	0	-	(5) (6)
158	SGP	Singapore	0	0	
166	ESP	Spain	0	-	(5) (6)
179	THA	Thailand	3	3	
192	USA	United States	0	-	(5)
197	VNM	Viet Nam	5	5	

## An Alternative Way (continued)

- I contend that “**sell-side**” credit ratings should be viewed as a “**public good**”.
- **Not-for-profit** credit ratings should be made widely available to compete with commercial credit rating firms.
- I envision a **co-opetition model** that need NOT be a **zero-sum game**.

(Duan and van Laere, 2012, “A *Public Good* Approach to Credit Rating – from concept to reality,” *J of Banking and Finance*)

# What kind of credit information?

- **Granularity** of credit information – should one be content with letter ratings or move on to probability of default (PD)?
- Being content with vaguely short-term or long-term? How about striving for a precise **term structure of PDs**?
- Going beyond **individual obligors** to address **credit portfolios**, and relating defaults to market risks (wrong-way risk).
- Beyond PD – recovery rate, contingent exposure, and risk premium.

## RMI's CRI infrastructure

- Risk Management Institute (RMI) of National University of Singapore launched its **public-good Credit Research Initiative (CRI)** in **July 2009**.
- In **July 2010**, RMI released daily updated PDs on about **17,000** exchange-listed firms in **12 Asian economies**.
- As of **July 2013**, RMI has already been producing daily updated PDs (1 month to 5 years) on about **35,000** currently active, exchange-listed firms in **106 economies**. In addition, historical PDs on about **30,000** delisted firms are made available. (**Web:** <http://rmicri.org>)



## RMI's CRI infrastructure (continued)

- The CRI is an example of transforming Big Data into Smart Data (credit information that is of high quality, timely, granular and easily aggregatable for various applications).
- This Smart Data (i.e., PDs) are distributed free of charge to anyone who wants to use. It functions like a truly freely accessible “public good.”
- The advancement of this Smart Data system is meant to be organic and evolutionary, counting on the collective undertaking of credit risk experts around the world participating on a voluntary basis. It is meant to work like a selective Wikipedia.

## RMI's default prediction model

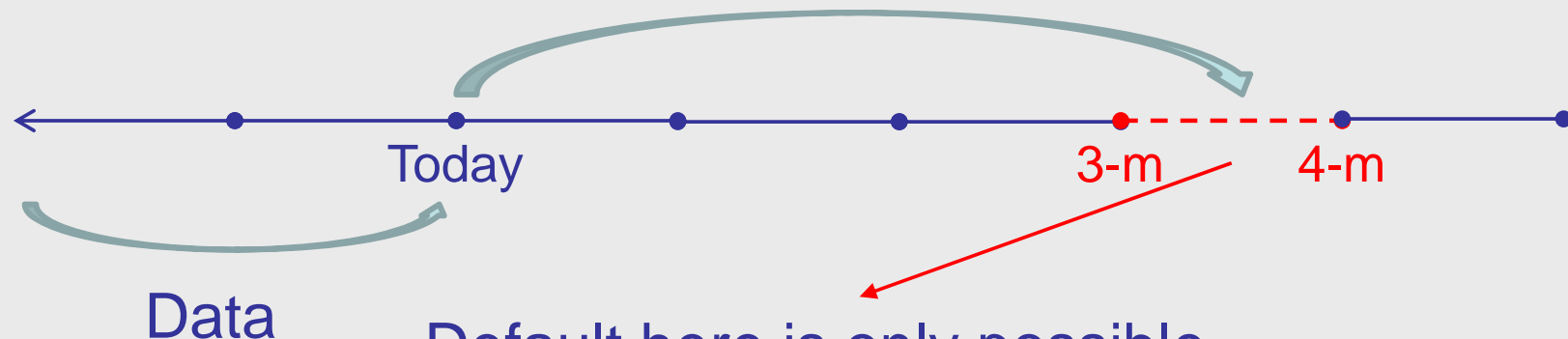
- The current version of RMI's model is a **bottom-up reduced-form** credit risk model developed by Duan, Sun and Wang (2012, *J. of Econometrics*) – assessing default likelihoods of **individual obligors** and **portfolios of obligors**.
- The model generates the **term structure of PDs** from one month up to five years.
- The model only deals with PDs, and is meant to be coupled with your own model on **recovery rates**, etc.

## RMI's default prediction model (continued)

- **Default and other exits**

A corporate obligor can disappear due to default/bankruptcy or M&A. The model accommodates these two competing risks.

- **Forward default probabilities** are the building blocks



Default here is only possible when the obligor has survived the first 3 months (default or M&A)

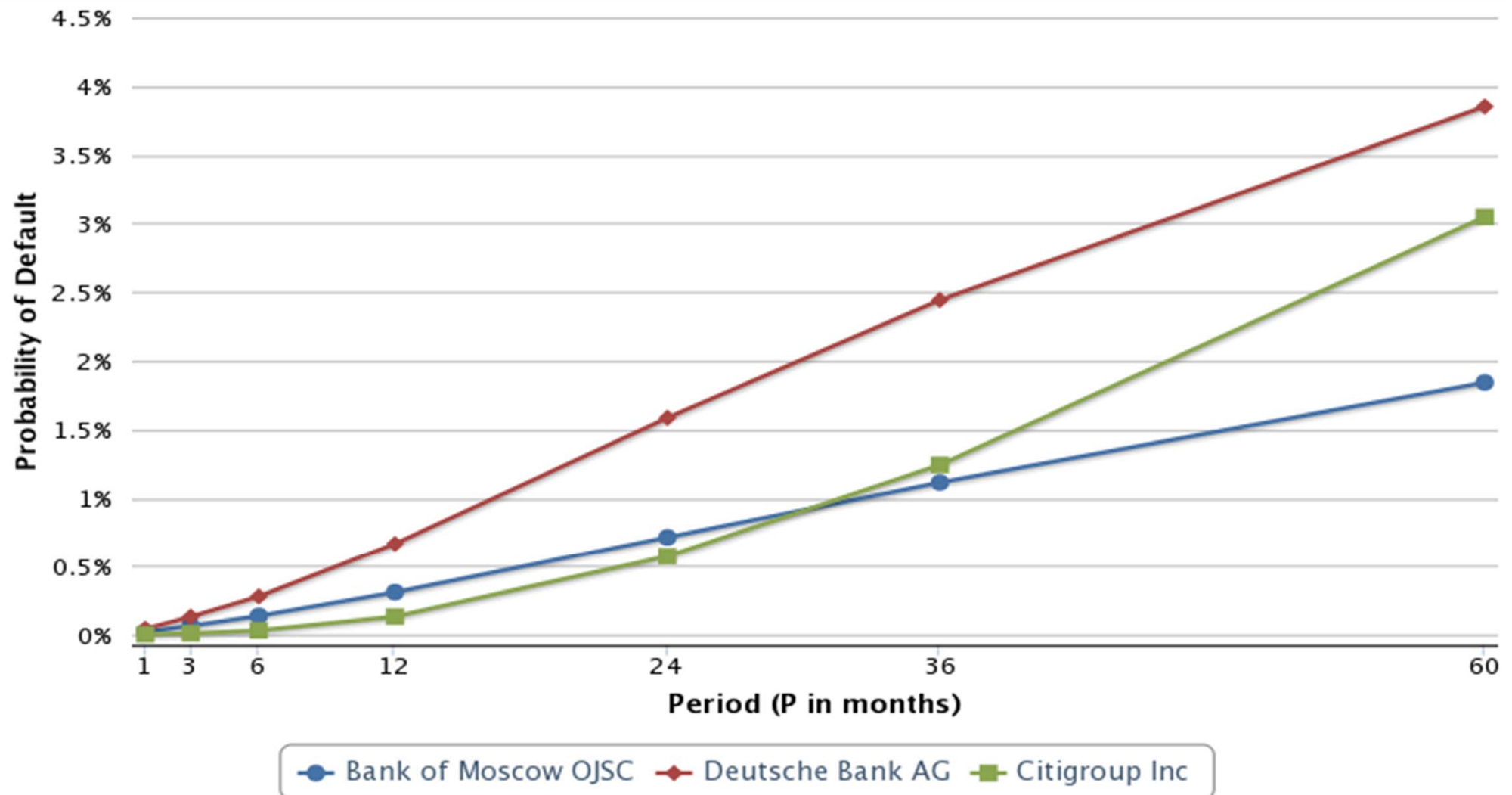
## RMI's default prediction model (continued)

- Default (or survival) probability of every forward period is captured by a function of variables that characterize state of the economy (**common macro variables**) and vulnerability of individual obligors (**firm-specific attributes**).
- The function is shared by all obligors but differ for different forward periods.
- The function's coefficients are specific to a forward period, but for adjacent periods, they are made to have **smoothly transitioned coefficients** via a term structure modeling technique.

## RMI's default prediction model (continued)

- The **common macro variables** used in the current version of the RMI model are
  - Trailing 1-year stock market return
  - Short-term risk-free rate
- The **firm-specific attributes** are
  - Distance-to-default (**level and trend**)
  - Ratio of cash to total assets (**level and trend**)
  - Ratio of net income to total assets (**level and trend**)
  - Relative size (**level and trend**)
  - Market-to-book value
  - Idiosyncratic volatility

# Single-Obligor Analysis



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# Single-Obligor Analysis (continued)

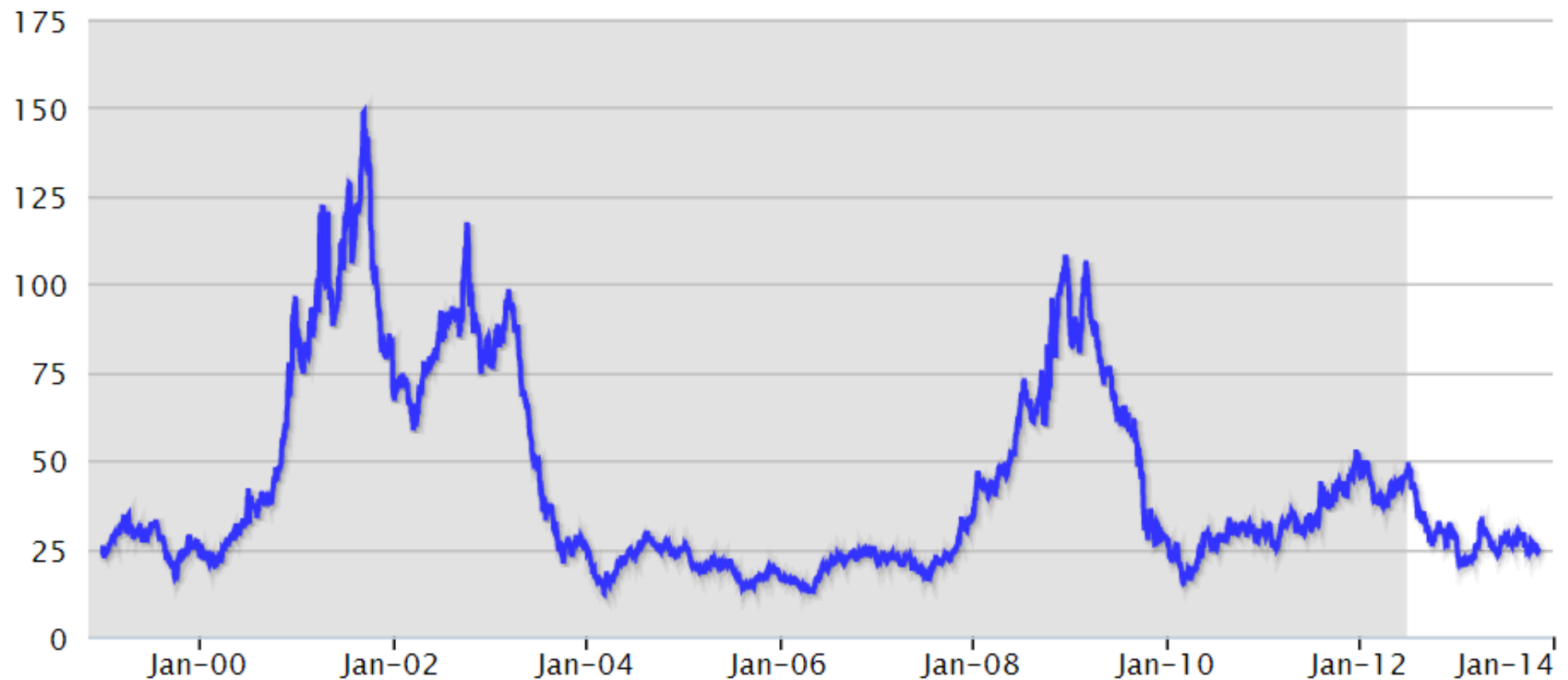


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# Simple Credit Portfolio Indicator

Corporate Vulnerability Index (equally-weighted)

CVIew (EMU)

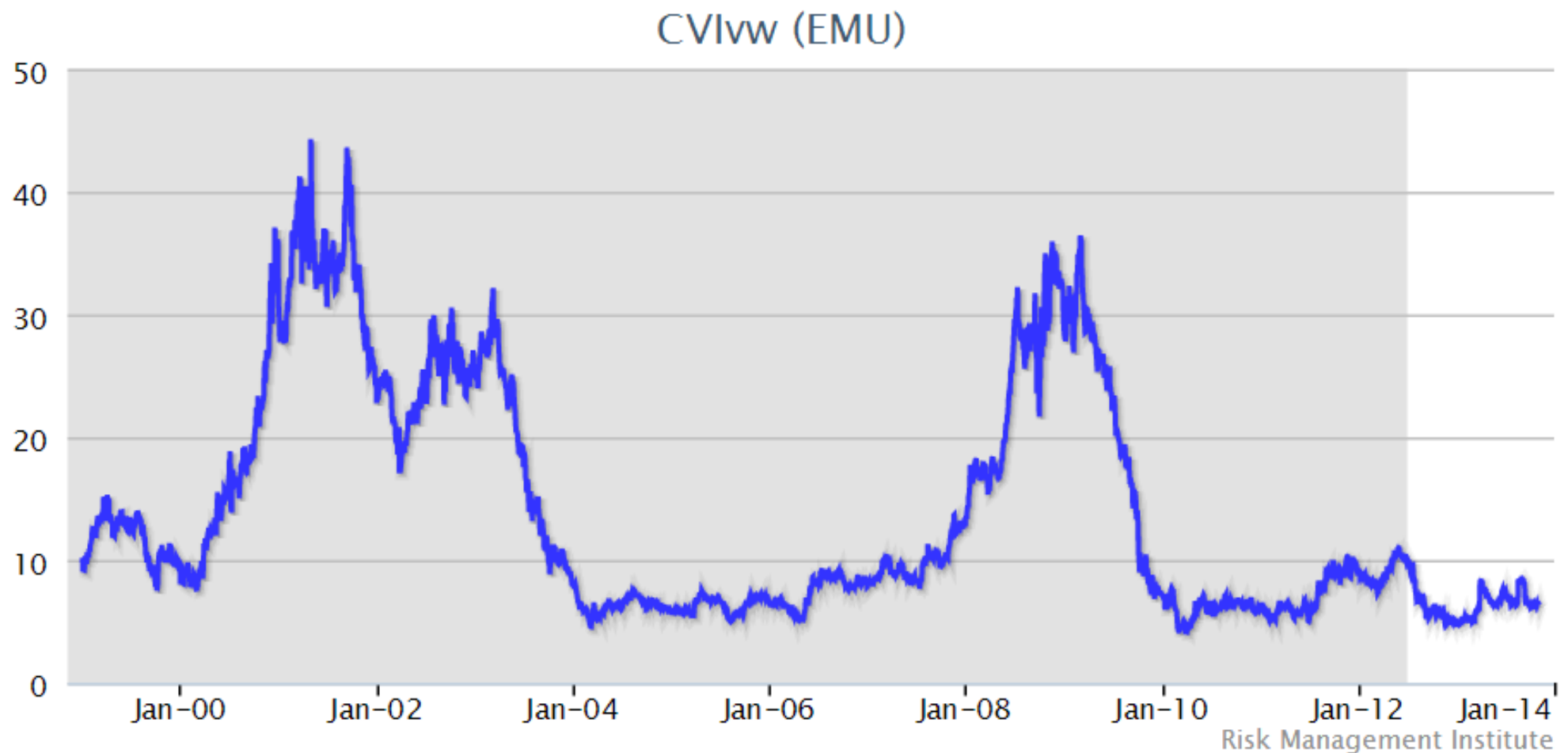


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# Simple Credit Portfolio Indicator

## Corporate Vulnerability Index (value-weighted)



# Credit Portfolio Analytics

## The RMI PD model

- The model attempts to describe a dynamic data panel of default/other exit indicators associated with obligors' attributes and macro risk factors at appropriate time points. The model has **default correlations** naturally built-in.
- Default correlations can be derived from a factor model using **one-month** default and other exit probabilities for all obligors in a target group. One also needs to make sure that the deduced longer-term individual obligor PDs match well with the longer-term RMI PDs for these obligors.

## **Credit Portfolio Analytics** (continued)

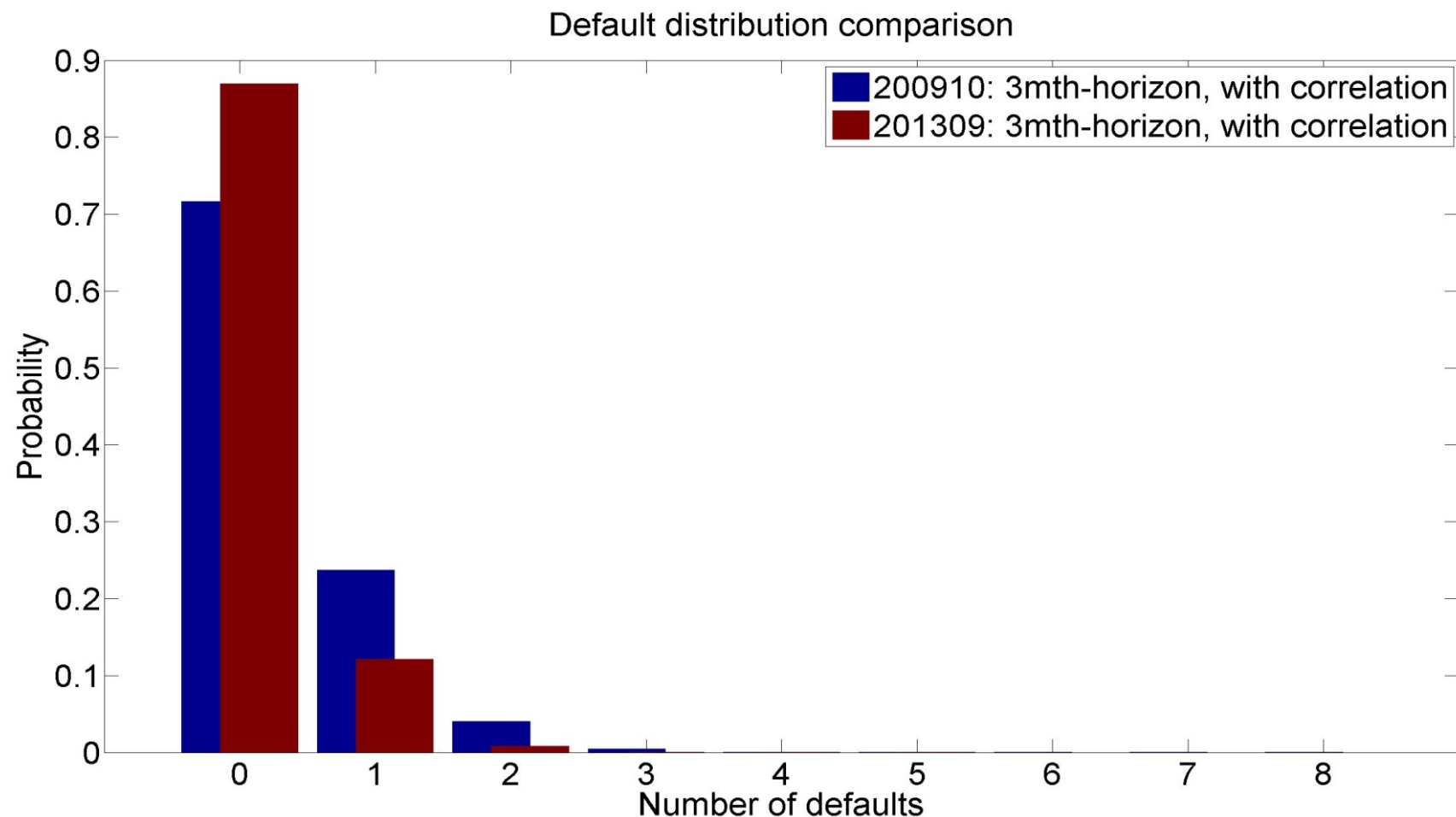
### **Elements of a credit portfolio analytics tool set**

- A PD model with default correlations that can be used for easy cross-sectional aggregation
- An LGD model

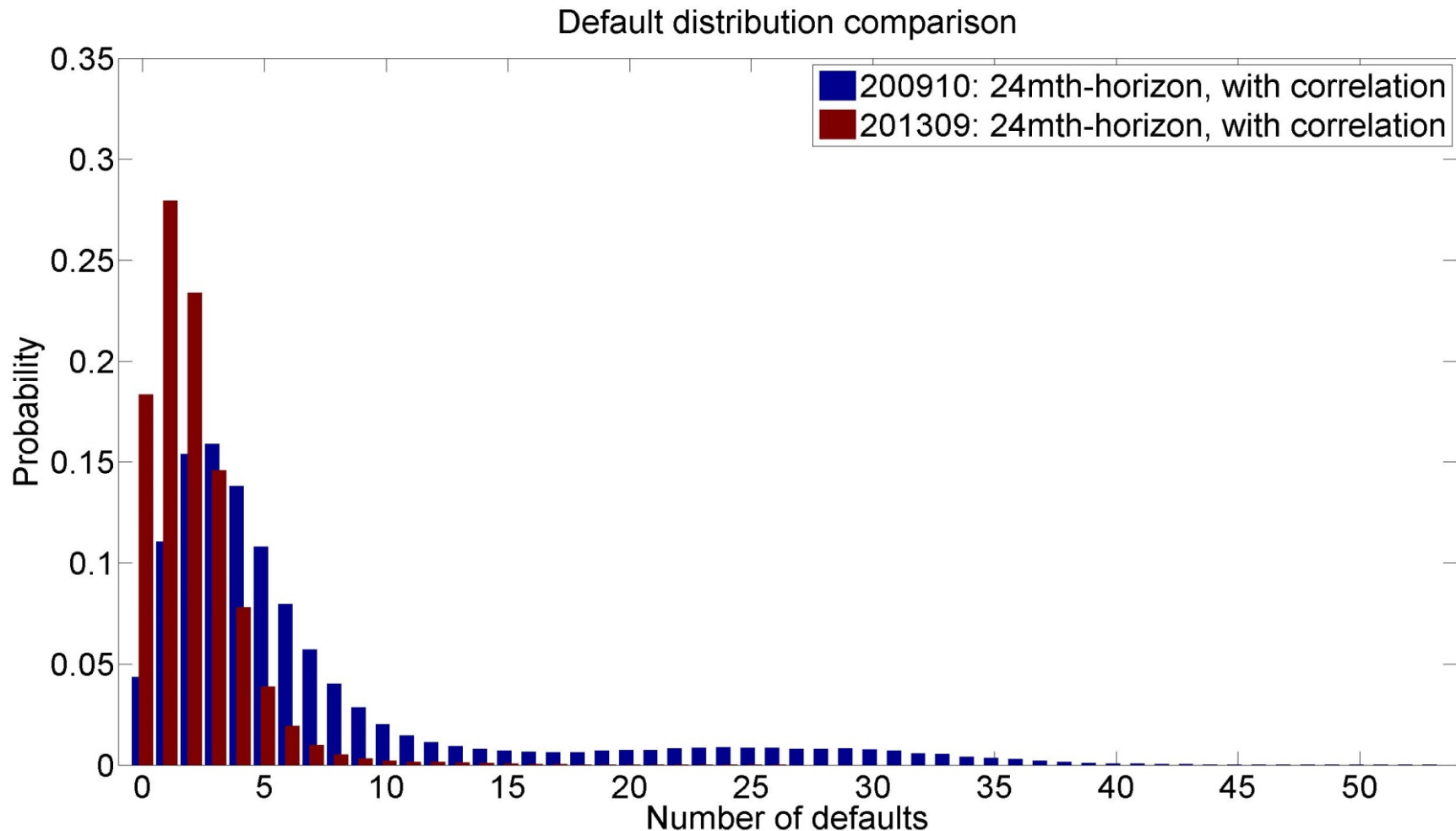
### **Additional information needed to implement the RMI model for credit portfolio management**

- Individual exposures (name and size)
- LGD assumption
- Actual risk premiums/spreads charged

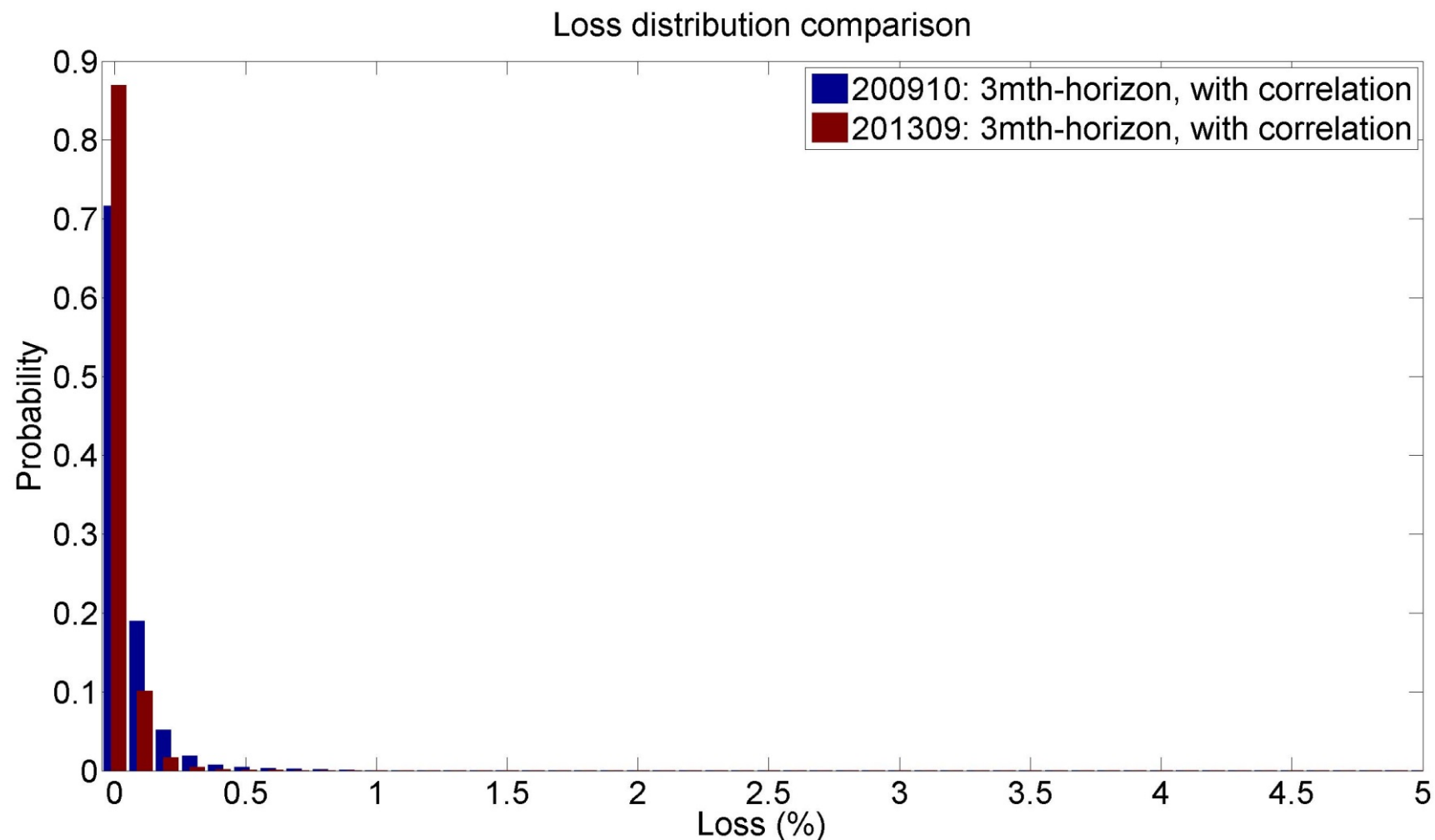
# Credit Portfolio Management



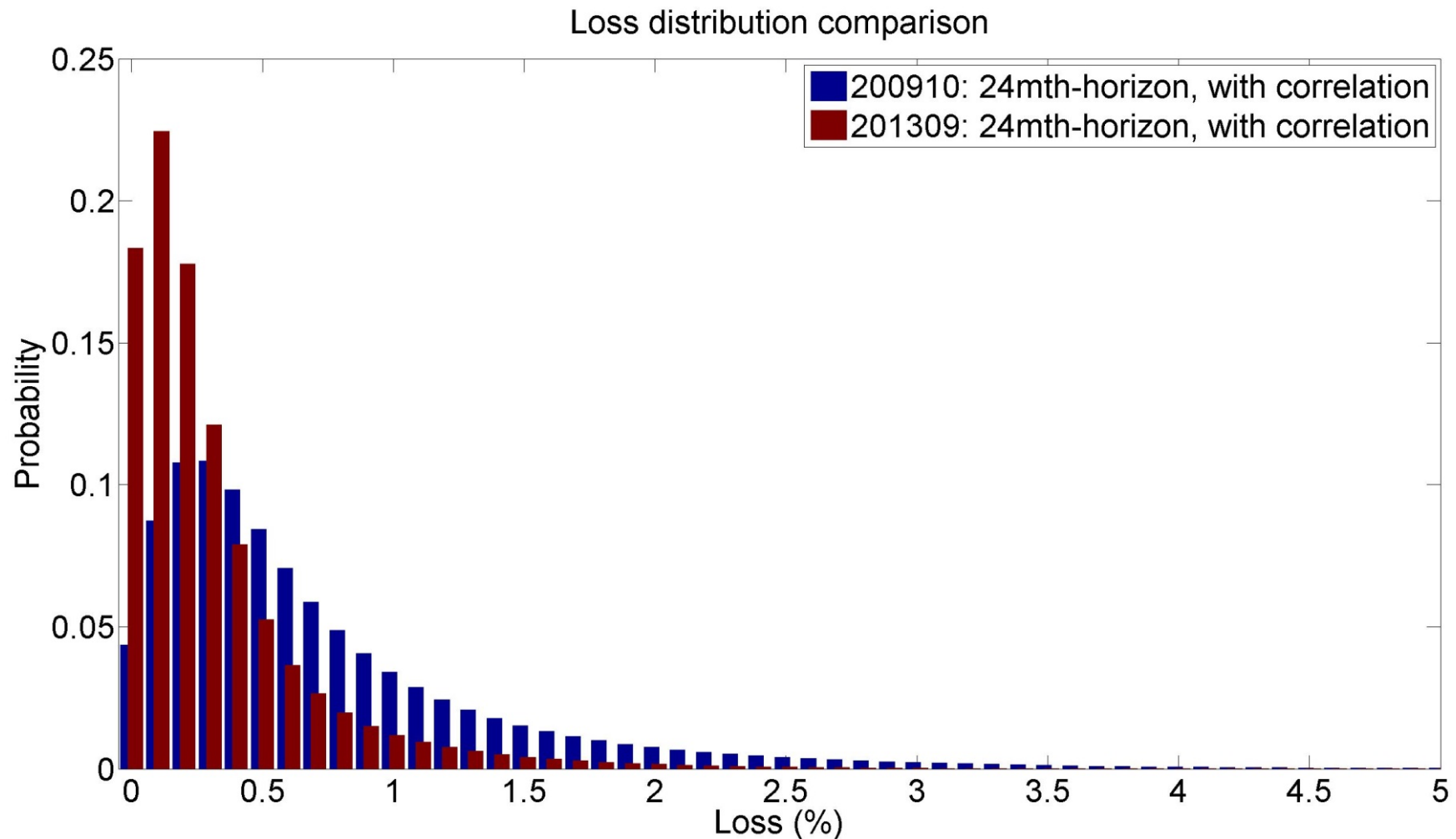
# Credit Portfolio Management (continued)



# Credit Portfolio Management (continued)



# Credit Portfolio Management (continued)



# Wrong-way Credit Risk

- In addition to default correlations among obligors, **market** and **default** risks are likely to move in tandem.
- The common factors underlying default correlations can be related to market risk factors such as crude oil price, exchange rate.
- One can then envision a future scenario for market risk factors and compare the default/loss distributions with and without the scenario.



# Wrong-way Credit Risk (continued)

Comparison on default distributions

