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# Climate Hazard Modelling: Impact of Floods on Credit Risk for the U.K. Mortgages

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# **Today's Speakers**

**Predictive Analytics** 









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### Moody's Climate Solutions

Forward-looking exposure metrics and risk analytics

#### Climate Risk Identification Physical Risk Data

Forward-looking data capturing exposure to climate hazards for: 5,000 listed companies (10,000 by end of 2021) with 2.5m corporate facilities globally; 17m commercial real estate properties in the US; and global sovereigns. On-demand scoring is available.

#### **Transition Risk Data**

Assessments of 5,000 companies (10,000 by end of 2021) to identify transition risk exposure from different fossil fuel resource types and power generation technologies. On-demand scoring is available.

#### **Climate Governance**

Assessments of 5,000 companies' climate risk disclosures and their ability to seize opportunities presented by climate change.



#### Climate Risk Quantification Macroeconomic Scenarios

Climate-adjusted macroeconomic forecasts with an 80-year horizon. Fully aligned with the Network for Greening the Financial System's (NGFS) representative scenarios for physical and transition risk.

#### **Climate-Adjusted PDs**

Climate-adjusted probability of default (PD) for listed and unlisted companies powered by Moody's award-winning Expected Default Frequency (EDF<sup>™</sup>) model.

#### **Climate Pathway Scenarios**

Tools that translate climate pathways into financial risk variables to inform asset allocation and liability models. Based on Moody's award-winning scenario generation software.

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# Agenda

- 1. Climate change and credit risk quantification framework: The case of mortgages
- 2. Moody's ESG Solutions' location-specific physical climate risk scores for the U.K.: Floods, heat stress, hurricane and typhoons, sea level rise, water stress, and wildfires
- 3. Do flood events affect probability of default for mortgages?
- 4. Constructing score-adjusted climate change scenarios and climateadjusted credit risk metrics
- 5. Climate Risk Adjustment



Climate change and credit risk quantification framework: The case of mortgages

# **Polling Question**

- 1. Have you already made a climate risk adjustment for a mortgage portfolio risk parameters (PD/LGD/Losses)?
  - A. Yes, leveraging on CBES 2021 instructions.
  - B. Yes, for a regulatory exercise other than CBES 2021.
  - C. Yes, for internal purposes.
  - D. No, not yet.

# Retail Credit Risk – Enhanced Framework

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Climate Hazard Modelling 8

# Climate Change Scenarios for the UK

Projections for HPI and unemployment rate





7.0

5.0

4.0

3.0





Real GDP Index, 2020Q4 = 100

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2044(

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049

2041Q 2042Q 2043Q

## Climate-Adjusted Credit Risk Approach





Location-specific physical climate risk scores for the U.K.: Floods, heat stress, hurricane and typhoons, sea level rise, water stress, and wildfires

# **Polling Question**

#### 2. What does your firm use physical risk data for?

- A. We don't use physical climate data
- B. To help comply with risk disclosure requirements
- C. Integrate climate risk into pre-acquisition/loan origination
- D. Integration into risk management processes/stress tests
- E. Multiple uses

## Physical Climate Risk for Mortgages

- » Based on global climate models & environmental datasets
- » Forward-looking scores for each climate hazard
- » Detailed underlying indicators





Source: Four Twenty Seven, part of Moody's ESG Solutions

## From Climate Data to Risk Scores



Air, ocean, and ice (including cliff) dynamics



Maximum St.

Elevation data (SRTM)

Historical sea levels and subsidence

Tidal gauge data for storm surge



Source: Four Twenty Seven

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### Assessing Climate Risk for a Property



Ν	Nortgage	e Example					⊥ Scorecard	⊥ CSV
Address:357 Rope Street, London, GBRCoordinates:(51.49305, -0.04001)			Activity:	Residential				
	Category	/			Risk Level	Category Score	)	Country Benchmark
+	Earthqua	akes			None	0		1
-	Floods				Medium	48		31
	Subcategory		Measure	Unit			Subcategory Score	Country Benchmark
	Flood Frequency			Return Period	ł		72	17
	Flood Severity			Meters			40	12
	Rainfall Inte	ensity	5.21	Percent			12	44
	Very Wet D	ays (>95th p)	1.09	Days			46	66
	Wet Days (	>10 mm)	0.81	Days			33	60
+	Heat Str	ess			Low	19		19
+	Hurrican	es & Typhoons			Low	49		50
+	Sea Lev	el Rise			None	0		7
+	Water St	ress			Medium	45		37
+	Wildfire				Low	26		25

# Physical Climate Risk Score

### Moody's ESG Solutions Data

- » 1,000 random names of the portfolio and ran the physical risk climate scores within the on-demand scoring application
- » Six climate hazards assessed at the facility-level: floods, sea level rise, water stress, heat stress, wildfire, and hurricanes & typhons
- » Majority of the portfolio is low risk but some material hotspots across specific climate hazards
- » While few UK facilities may lead to Red Flags, UK Floods and Seal Level Risk scores can easily double or triple, amplifying damages for local economies and assets
- » Flood risk followed by Water Stress appears to the be prominent climate hazards affecting the portfolio analysed





Do flood events affect probability of default for mortgages?

# **Polling Question**

3. What is the expected impact of climate events such as floods on PD for mortgages?

- A. The impact is statistically negligible.
- **B**. PD increases by less than 1%
- C. PD increases by more than 1%.

## Linking Probability of Flood Events to Credit Risk

Flood Frequency Score

Return period of<br/>inundation1-in-5 years1-in-10 years1-in-20 years1-in-50 years1-in-75 years1-in-75 years1-in-200 years1-in-200 years1-in-250 years1-in-500 years1-in-500 years1-in-500 years1-in-500 years1-in-500 years1-in-500 years1-in-500 years1-in-500 years1-in-1000 years1-in-1000 years1-in-1000 years1-in-1000 years1-in-1000 yearsNone

Flood Frequency Categories





Climate Event Simulation Engine

Frequency scores are translated into probability of events based on the property's location. When will the event occur?

- Impact on macroeconomic drivers (e.g., HPI).
- » Impact on credit risk metrics such as PDs & LGDs (idiosyncratic impact).

How severe will the hazard be?



# Climate Adjustment to the PD Model

From standard PD metrics to climate-adjusted PDs

#### Standard PD model:

Climate-Adjusted PD model:

i specific event

**Climate Hazard Modelling** 

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» Determine affected areas/regions: we analysed impact at NUTS1, NUTS2 and NUTS3 levels for the UK.

- » Define flooded vs. partially flooded areas: we explored different levels of % of area flooded (>0%, >20%, >40%, >50%, >60%, >70%, >80%, >90%, 100%).
- » Ensure event effect is captured (instead of seasonality effect).
- » When is the effect in PD observed?: we analysed the impact 0 to 6 months after the flood event was observed.

For each event we compute: 
$$\ln\left(\frac{DR}{1-DR}\right) = \ln\left(\frac{\widehat{DR}}{1-\widehat{DR}}\right) + \gamma Event_{j,NUTSi,p,t+k} + \mu$$
  
i: NUTS level  
p: proportion of area affected by the event  
t: time of the event  
k: months after the event

### **Flood Events Data**

Data related to 74 flood events in the UK from 1989

#### Floods data

#### Location

Start and End dates

Duration

Severity

#### Magnitude

Cause (heavy rain, tropical cyclone, rain and snowmelt, torrential rain, storm surge)

Number of casualties

Number of displaces



8°W 6°W 4°W 2°W 0° 2°







# **Defining Impacted Areas**

### Selected example



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# **Areas of significant flood events - NUTS3** $\ln\left(\frac{DR}{1-DR}\right) = \ln\left(\frac{\widehat{DR}}{1-\widehat{DR}}\right) + \gamma Event + \mu$



Flood Event #4319 PD dummy representation - % Flood > 40%







Flood Event #4111 PD dummy representation - % Flood > 40%



### **NUTS3 Estimated PD range**



PD 🛱 StandardPD 턲 ClimateAdjustedPD

NUTS3 affected by Event 4111:

PD	Min.	1 <sup>st</sup> Qu.	Median	Mean	3 <sup>rd</sup> Qu.	Max.
Standard	0.0004%	0.026%	0.046%	0.073%	0.081%	8.068%
Climate	0.0005%	0.033%	0.058%	0.093%	0.102%	10.022%

#### NUTS3 affected by Event 4319:

PD	Min.	1 <sup>st</sup> Qu.	Median	Mean	3 <sup>rd</sup> Qu.	Max.
Standard	0.0001%	0.0075%	0.0125%	0.0164%	0.0205%	0.6301%
Climate	0.0002%	0.0150%	0.0252%	0.0329%	0.0412%	1.2572%

#### NUTS3 affected by Event 4563:

PD	Min.	1 <sup>st</sup> Qu.	Median	Mean	3 <sup>rd</sup> Qu.	Max.
Standard	0.0003%	0.0145%	0.0253%	0.0314%	0.0414%	1.7183%
Climate	0.0006%	0.0281%	0.0491%	0.0610%	0.0805%	3.2863%

## Areas of significant flood events – NUTS1 $\ln\left(\frac{DR}{1-DR}\right) = \ln\left(\frac{\widehat{DR}}{1-\widehat{DR}}\right) + \gamma Event + \mu$

60°N

56°N

54°N

52°N

50°N



PD dummy representation - % Flood > 40%

Flood Event #4319

60°N

54°N

52°N

50°N









#### 60°N 58°N γ = 0.427 56°N



Flood Event #4328

PD dummy representation - % Flood > 0%

8°W 6°W 4°W 2°W 0° 2°E

#### Climate Hazard Modelling 25

## **NUTS1 Estimated PD range**





#### NUTS3 affected by Event 4111:

PD	Min.	1 <sup>st</sup> Qu.	Median	Mean	3 <sup>rd</sup> Qu.	Max.
Standard	0.0004%	0.026%	0.046%	0.073%	0.081%	8.068%
Climate	0.0005%	0.033%	0.058%	0.093%	0.103%	10.085%

#### NUTS3 affected by Event 4319:

PD	Min.	1 <sup>st</sup> Qu.	Median	Mean	3 <sup>rd</sup> Qu.	Max.
Standard	0.0001%	0.0075%	0.0125%	0.0164%	0.0205%	0.6301%
Climate	0.0005%	0.028%	0.048%	0.062%	0.078%	2.477%



Constructing scoreadjusted climate change scenarios and climateadjusted credit risk metrics

# **Polling Question**

4. For a particular region – say, Greater London – what do you think is the largest absolute difference between the smallest and largest decline in HPI?

- A. Less or equal 10%
- B. Greater than 10% but less or equal 20%
- C. Greater than 20%

# Linking Severity of Climate Events to Credit Risk

### Impact of flooding in HPI

- 1. Analyse 70+ flooding events in the UK.
- 2. Classify the events based on severity.
- 3. Analyse the impact on HPI after the event is observed by severity buckets.



### Impact of Flooding in Location-specific HPI



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# Impact of Flooding Events in LGD

### Location-specific LGD

Climate-Adjusted LGD by Severity of Flood Event, peak value





## **Climate Risk Adjustment**

# Location-Specific Climate Risk

### Modelling Methodology



#### **Climate Risk Scores**

Obtain climate risk scores at the facility level. Access to six climate event risk scores based on the geographic

#### **Climate Scenarios**

Build country-specific climate scenarios (e.g., NGFS Current Policy, NGFS Early Policy, NGFS Late Policy).

#### **Score-Adjusted Scenario**

Compute climate event risk adjustments to the economy based on the climate risk scores and location such that riskier areas face more severe scenarios.

#### **Climate-Adjusted Credit Risk Metrics**

Forecast credit risk metrics (PDs, LGDs, EADs) based on score-adjusted



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