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## CCAR and 3<sup>rd</sup> Quarter Reporting: COVID Induced Cultural Shifts in Credit Modeling

OCTOBER 2020

## **Goals for Today**



Review the challenges with forecasting credit losses



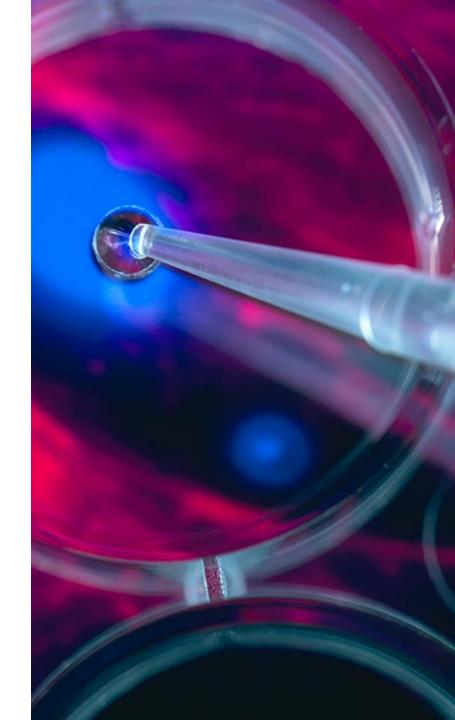
Demonstrate the value of alternative data and analytics anchored to traditional scenarios



Propose an approach to assess cross-industrycountry risk due to COVID induced cultural shifts







## **Today's Speakers**







## Amnon Levy

Head of Portfolio Management

Head of Strategic Accounts-Americas

**Tim Daly** 

Anna Krayn Enterprise Risk Solutions Moderator

## **Observed Challenges in the Industry**

"Historical relationships are clearly broken, we can't rely solely on the tools from the past and believe the answers."

Head of Model Development Mid-size US Bank We need a new way of looking at credit, the old way won't work in this environment. We are defining a new risk appetite at a more detailed level

Head of Credit Strategies Large Multi-National Bank It's unreasonable to downgrade everyone. We need a better way to sift through the noise within industry groups to arrive at a tractable approach for credit monitoring over the long term."

Global Credit Analytics Group Large US Bank

## Environment and Credit Risk Measurement Nature of risks and their uncertainty likely to persist



#### Challenges with Credit Risk Measurement

- Internal Rating rely on fundamental name-level analysis, difficult to update quickly, and require quantification of loss for CCAR and impairment
- » Credit Loss Forecast Models often calibrated to past downturns and not accurately reflecting COVID's cross-sectional impact

## **Challenges with Credit Loss Forecast Models**

#### **CCAR and Impairment Models**

- » Can't describe COVID's evolving and varying impact on sociological shifts and credit segments
- » Unable to capture government and fiscal policy impact across segments
- » Leverage broad-brush economic scenarios that have been extreme, often out of range, and not representing the credit environment

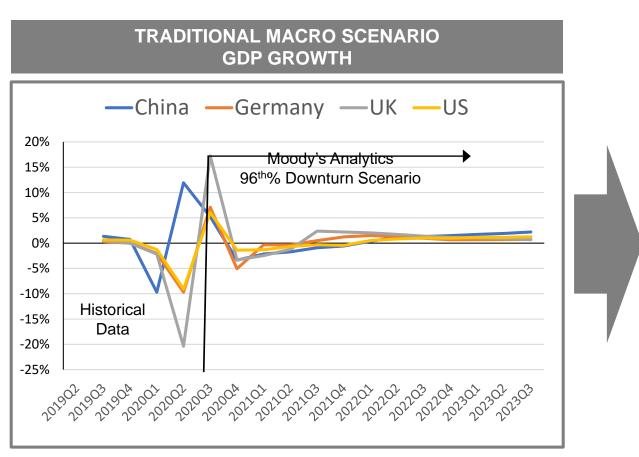
#### **Data and Analytics for Emerging Risks**

- » Alternative Data
  - Epidemiological
  - Mobility
  - Supply Chain and Geolocation
  - Tourism and Trade...

- » Flexible and anchored to internal models
- » Emerging risks transcend COVID Hazard events (e.g., Fukushima)

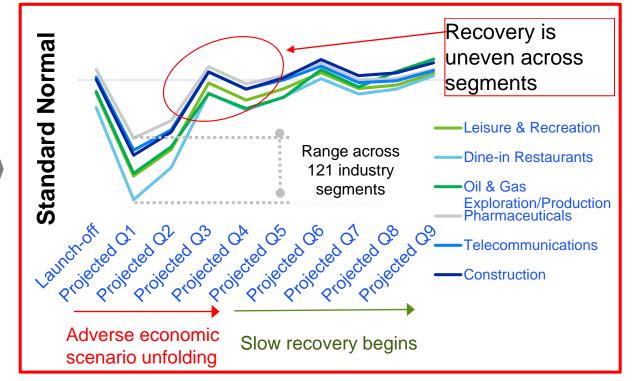
Climate (e.g., Australian and California wildfires)

## A Cross-Sectional COVID Overlay for Credit Loss Forecasting



Source: Moody's Analytics

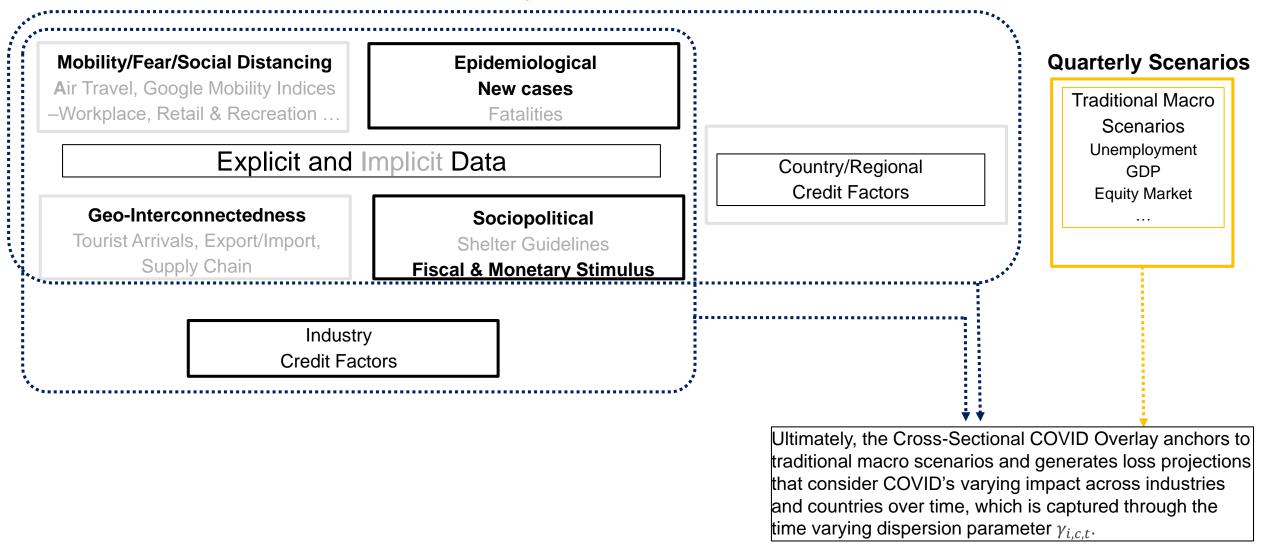
ANCHORING TO TRADITIONAL MACRO SCENARIOS THE CROSS-SECTIONAL COVID-19 OVERLAY USES GRANULAR CREDIT AND ALTERNATIVE DATA TO DIFFERENTIATE COVID'S IMPACT ACROSS SEGMENTS



Source: Moody's Analytics

## Alternative Data and Analytics for Emerging Risks

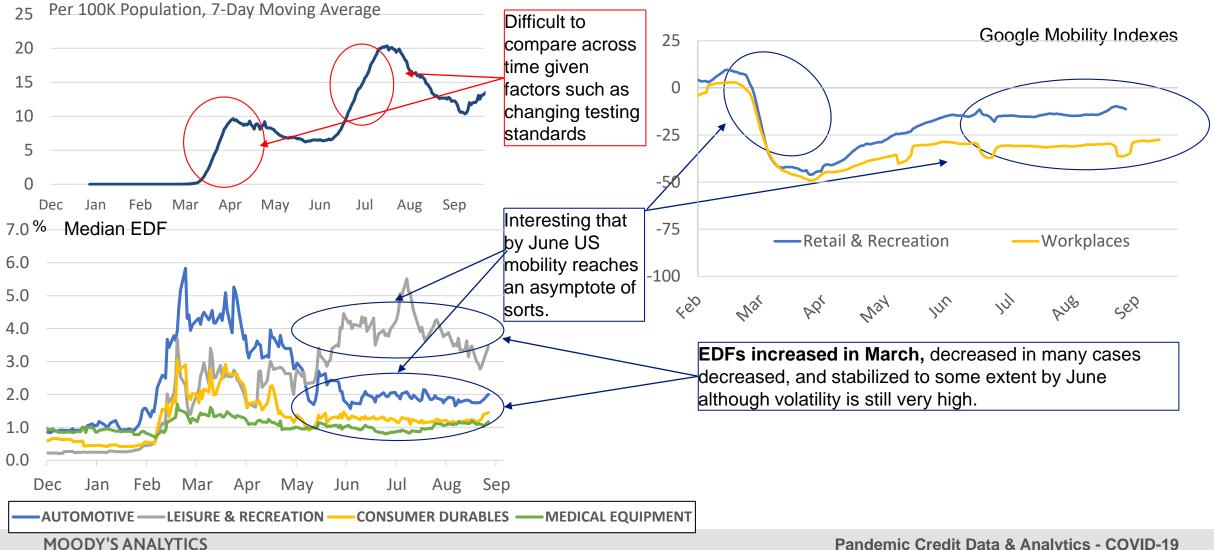
### **Cross-Sectional COVID 19 Overlay**



## Alternative Data, Transient/Permanent Behavior Shifts, and Credit Risk

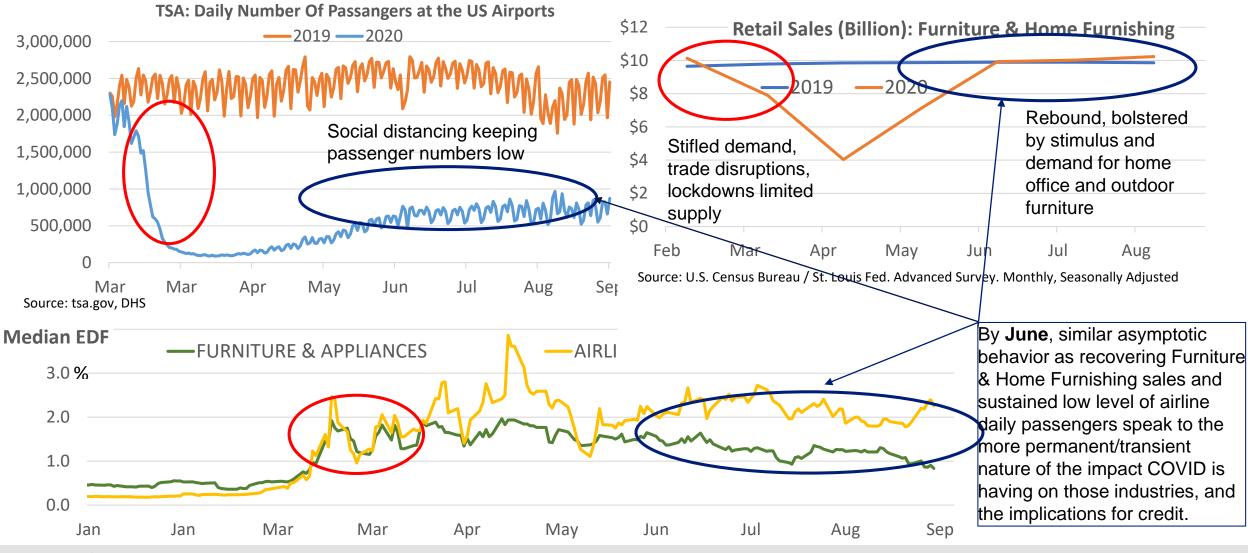
### Insights from the US to guide cross industry quantification

Daily New COVID-19 Cases



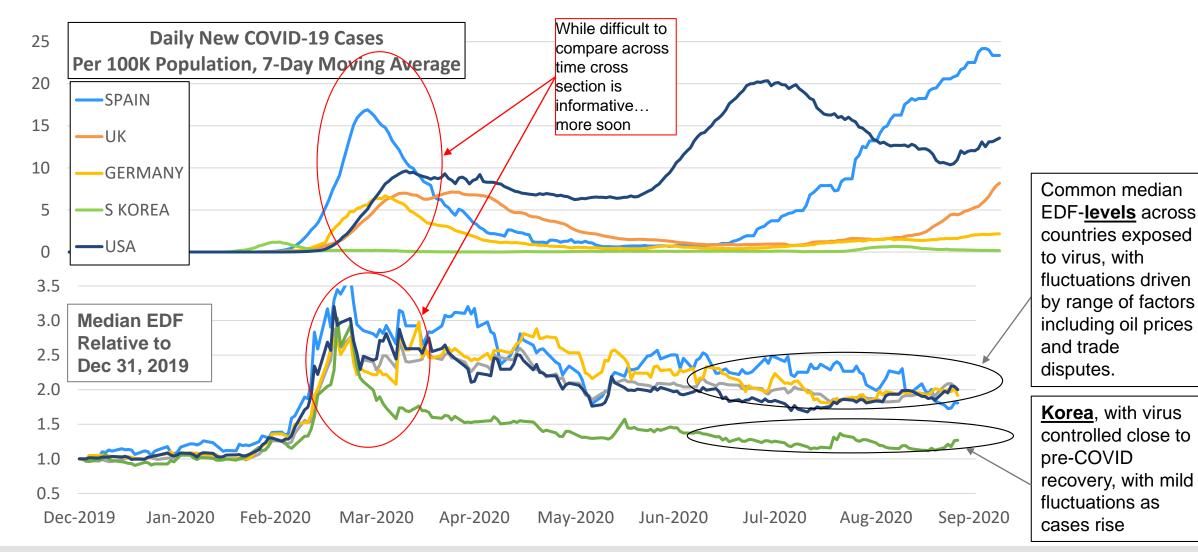
## Alternative Data, Transient/Permanent Behavior Shifts, and Credit Risk

Insights from the US to guide cross industry quantification



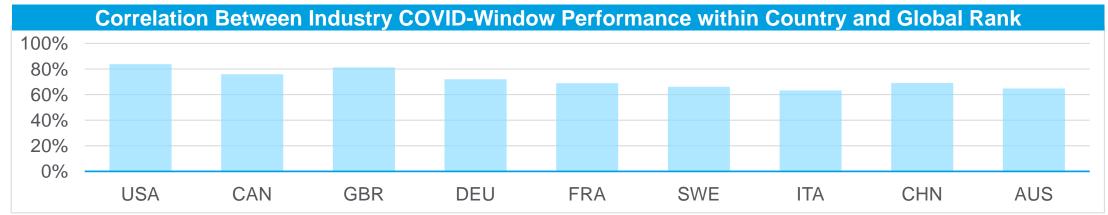
## Alternative Data, and Cross-Country Credit Risk Dynamics

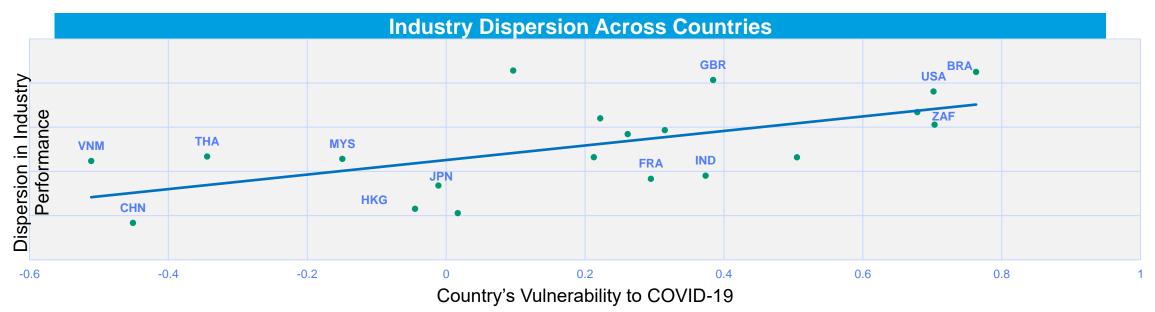
Common patterns in median default probability levels



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## COVID's Cross-Industry Impact Similar in Rank Across Countries But with material variation in dispersion...

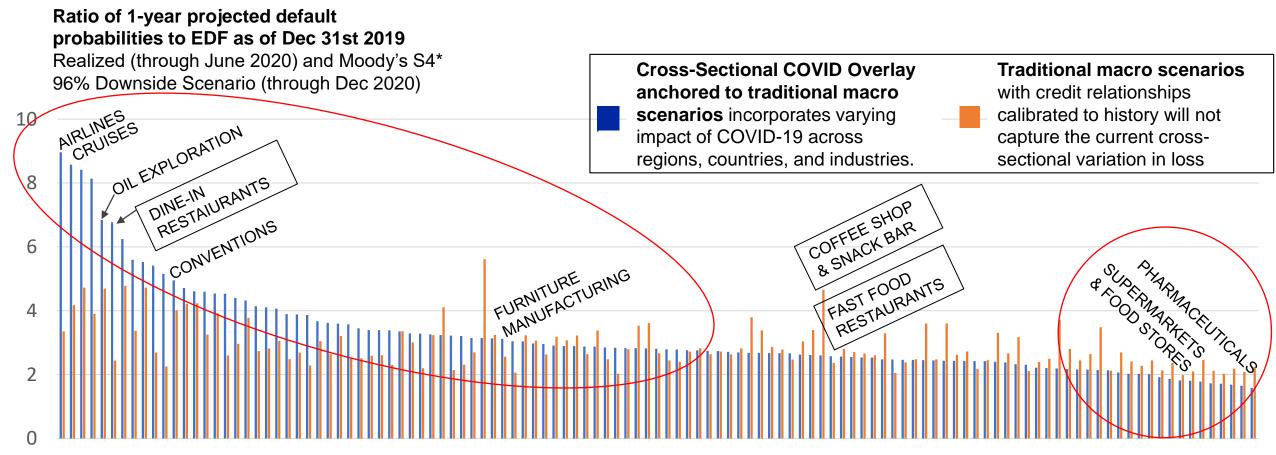




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## **Cross-Sectional COVID-19 Overlay Results**

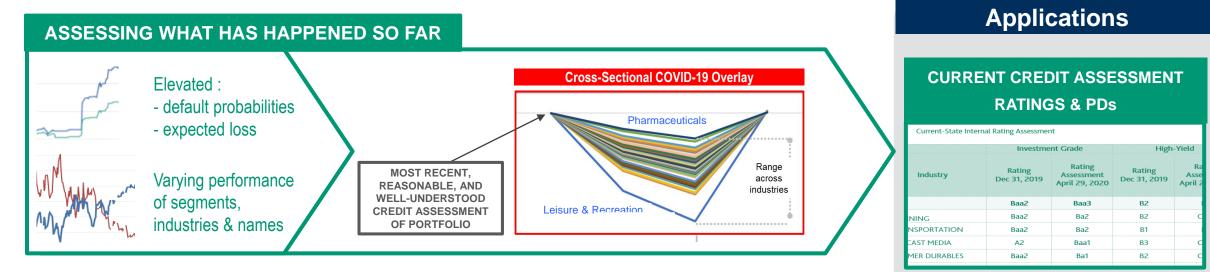
A re-evaluation of industry segmentation and credit dynamics



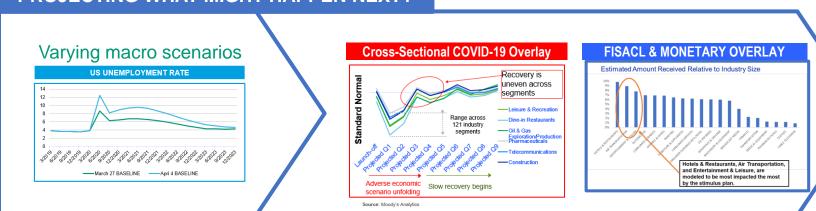
Source: Moody's Analytics Public Firm Sample Firms with Dec 2019 EDF<3% \*U.S. 96th% Downside (S4): assumes the crisis to last significantly longer with more cases and deaths than anticipated. Business closures wind down much more slowly than in the Baseline. There is a modest rebound in 2020 Q3 but a second wave of recession begins in 2020 Q4 until 2021 Q3. Real GDP growth rate is projected to be -7% in 2020 and -4.3% in 2021 (compared to -4.9% and 2.6%, respectively, in the Baseline). Unemployment rate reaches a peak of 13% in early 2022. Disagreements in Congress prevent the passage of additional fiscal stimulus.

## Cross Sectional COVID Overlay

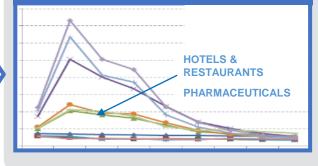
Measuring COVID's evolving impact on credit loss forecasts



#### **PROJECTING WHAT MIGHT HAPPEN NEXT?**

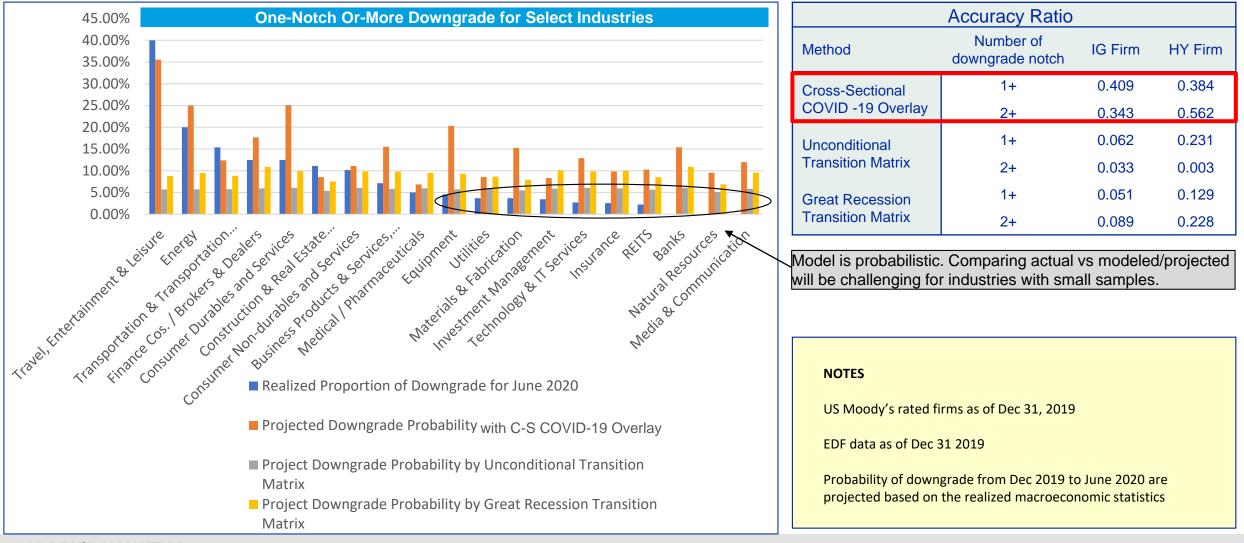


#### PROJECTED RATINGS, OTTI, RBC, SPREADS AND LOSS MEASURES for CCAR/CECL REPORTING



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## Performance - December 2019 to June 2020 Credit Migration and Cross-Sectional COVID-19 Overlay



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Pandemic Credit Data & Analytics - COVID-19 15

## 2020 Expected Default Rates - Select Industries

### Impact of Cross-Sectional (C-S) COVID-19 Overlay

	Average On	e-year D	efault Pro	obabilities	6 (Dec 20	19 to Dec	2020)			
	US				German		UK			
Industry	EDF	Baseline	Baseline	EDF	Baseline	Baseline	EDF	Baseline	Baseline	
	31-Dec-19		With C-S COVID Overlay	31-Dec-19		With C-S COVID Overlay	31-Dec-19		With C-S COVID19 Overlay	
eisure & Recreation	1.82%	3.12%	4.57%	0.13%	0.25%	0.47%	0.20%	0.63%	1.21%	
Clothing and Non Durables Retail/Wholesale	1.79%	2.93%	4.35%	4.54%	6.91%	9.47%	2.07%	4.02%	5.08%	
Banks and S&Ls	0.36%	0.85%	0.93%	0.34%	0.88%	0.97%	0.84%	2.29%	2.31%	
Computer Software	0.95%	1.62%	1.49%	1.01%	1.67%	1.62%	1.03%	2.01%	2.00%	
nvestment Management	0.59%	1.32%	1.09%	0.55%	0.95%	0.89%	0.17%	0.53%	0.45%	
						<b>^</b>				

Source: Moody's Analytics

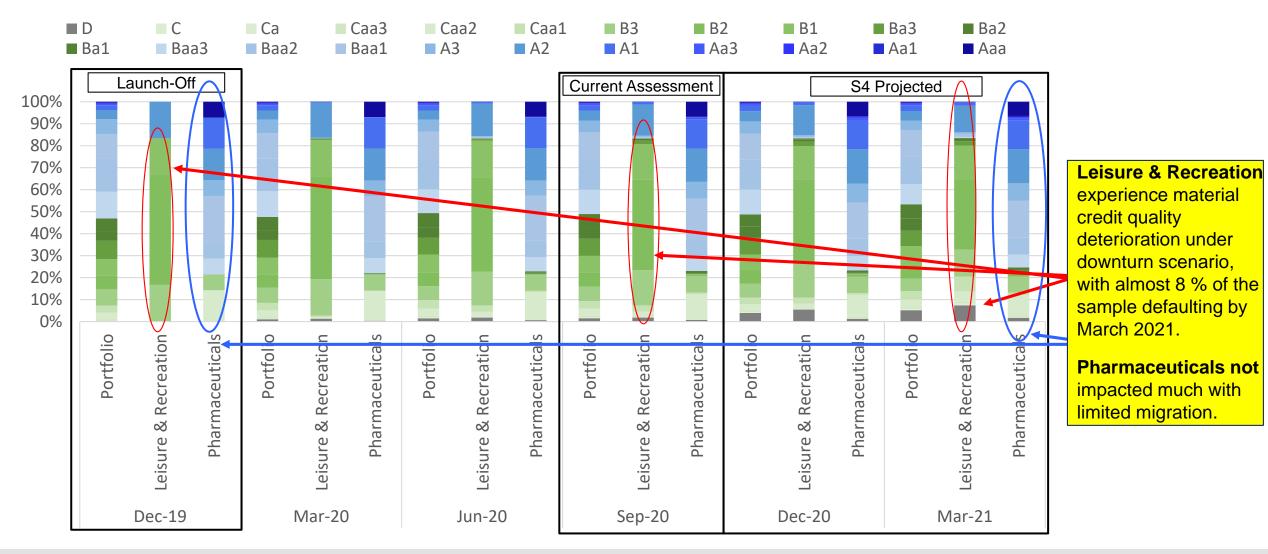
- Public Firm Sample Firms with Dec 2019 EDF<3%</li>
- September vintage scenarios (realized shocks for 2020 Q1 and 2020 Q2, projected shocks for 2020 Q3 and 2020 Q4).
- C-S COVID Overlay as of September, 2020.

UK economic scenario is more severe than Germany or US. The US and UK industries are more sensitive to COVID, and have a higher dispersion parameter than Germany.

Recreation relative performance deteriorates and Computer Software and nvestment Management improves with Cross-Sectional COVID Overlay

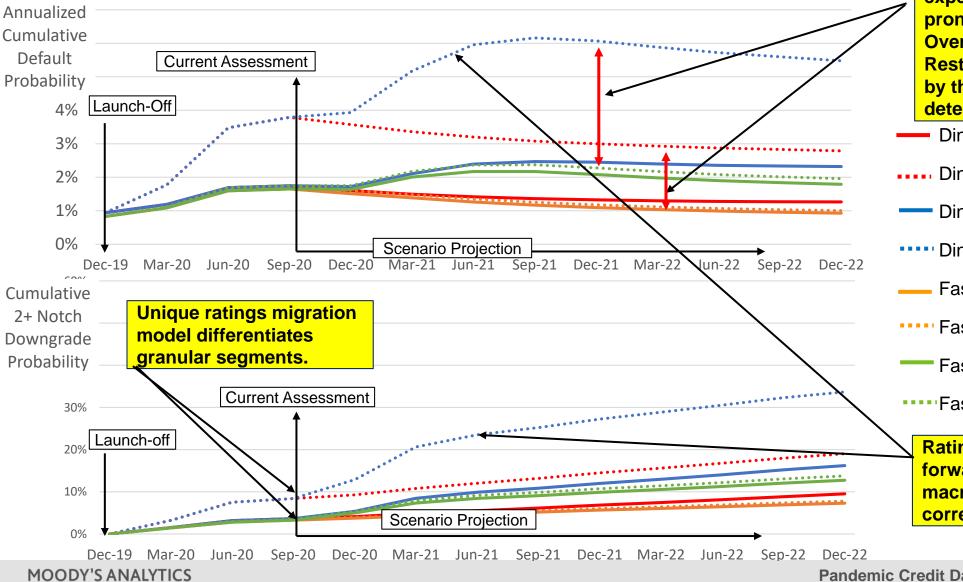
## Rating Composition Forecasts – Select US Industries

Current (through September) and S4 96% downside projection



### **Current PD and Rating Assessments and Credit Loss Forecasts**

### US Dine-In and Fast-Food Restaurants



Dine-In Restaurants in US experience an even more pronounce deterioration once the Overlay is accounted for. Fast-Food Restaurants, though still impacted by the Pandemic, exhibit a lower deterioration relative to Dine-In.

Dine-In Baseline w/o C-S Overlay

Dine-In Baseline with C-S Overlay

Dine-In S4 w/o C-S Overlay

..... Dine-In S4 with C-S Overlay

Fast-Food Baseline w/o C-S Overlay

Fast-Food Baseline with C-S Overlay

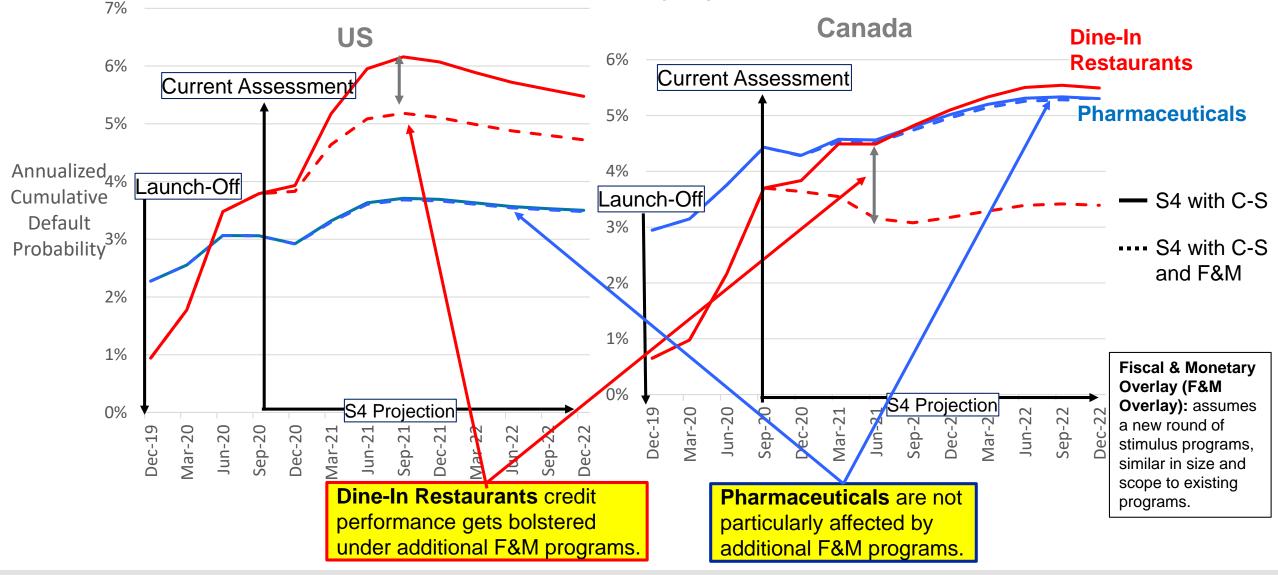
Fast-Food S4 w/o C-S Overlay

----- Fast-Food S4 with C-S Overlay

Ratings react more slowly than forward looking PD to macroeconomic conditions, corresponding to empirical patterns.

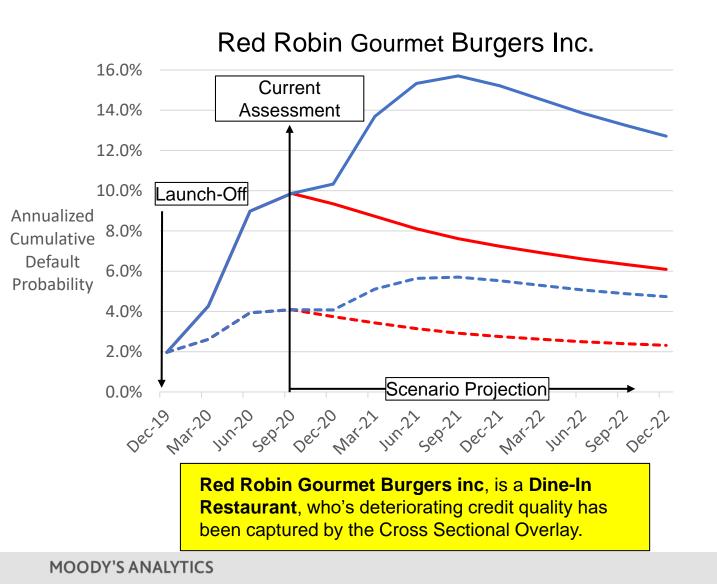
### Impact of Additional Fiscal and Monetary Actions Across US and Canada

Current Assessment and S4 96% downside projected

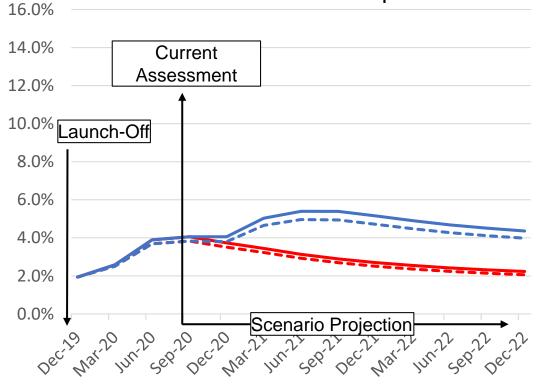


### **Name-Level Dynamics**

Dine-In vs Fast-Food (Take-Out) Restaurants



Baseline w/o C-S Overlay
Baseline with C-S Overlay
S4 w/o C-S Overlay
S4 with C-S Overlay



Fiesta Restaurant Group Inc.

Fast-Food Restaurants, such as Fiesta Restaurant Group Inc, are less impacted by the pandemic compared to Dine-In or

## **Pandemic Credit Data and Analytics (PCDA)**

#### **Fiscal and Monetary Action Settings**

Select Existing Scenario

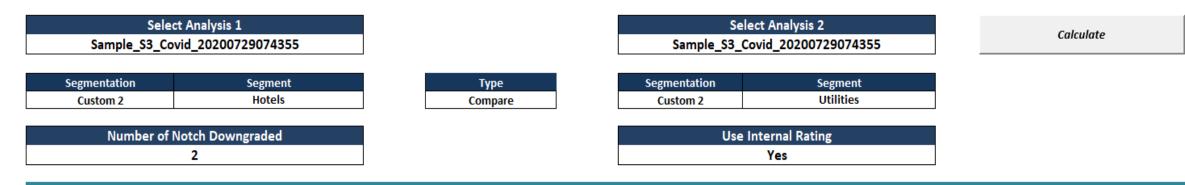
Add Fiscal & Monetary Overlay

New Scenario Name

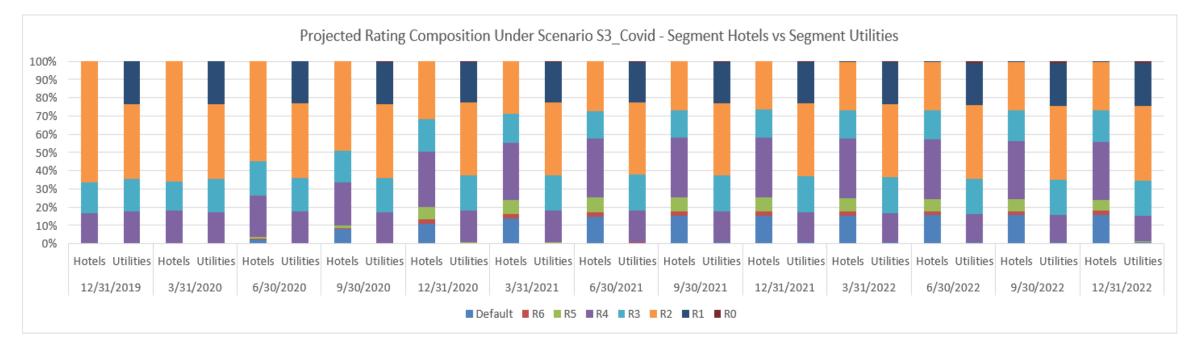
Name	Included	Size (U	SD billion)	Country	Туре	Target Size	Target Credit Quality	Target Industry Code	<b>Starting Quarter</b>
Direct payments to taxpayers	Yes	\$	300.00	USA	Consumer_spending	ALL	ALL	ALL	2020-Q2
Increase jobless benefits	Yes	\$	260.00	USA	Consumer_spending	ALL	ALL	ALL	2020-Q2
Student loans	Yes	\$	7.92	USA	Consumer_spending	ALL	ALL	ALL	2020-Q2
PPP loans	Yes	\$	395.40	USA	Consumer_spending	ALL	ALL	ALL	2020-Q2
Defense Industry Bailout	Yes	\$	17.00	USA	Bailout	ALL	ALL	N01	2020-Q2
Airline Bailout	Yes	\$	50.00	USA	Bailout	ALL	ALL	N03	2020-Q2
Commercial Paper Funding Facility	Yes	\$	100.00	USA	Subsidized_lending	ALL	IG	ALL	2020-Q2
Money Market Fund Liquidity Facility	Yes	\$	100.00	USA	Subsidized_lending	ALL	IG	ALL	2020-Q2
Main Street Lending Program	Yes	\$	600.00	USA	Subsidized_lending	TS1,TS2	ALL	ALL	2020-Q2
Primary Market Corporate Credit Facility	Yes	\$	500.00	USA	Subsidized_lending	ALL	IG	ALL	2020-Q2
Municipal Liquidity Facility	Yes	\$	350.00	USA	Subsidized_lending	ALL	IG	ALL	2020-Q2
Secondary Market Corporate Credit Facility	Yes	\$	250.00	USA	Subsidized_lending	ALL	IG	ALL	2020-Q2
Term Asset-Backed Securities Loan Facility	Yes	\$	100.00	USA	Subsidized_lending	ALL	ALL	ALL	2020-Q2
Bankers' Acceptance Purchase Facility	Yes	\$	6.30	CAN	Subsidized_lending	ALL	ALL	ALL	2020-Q2
BCAP BDC Co-Lending to SMEs	Yes	\$	15.00	CAN	Subsidized_lending	TS1,TS2	ALL	ALL	2020-Q2
BCAP BDC MidMarket Financing Program	Yes	\$	15.00	CAN	Subsidized_lending	TS2	ALL	ALL	2020-Q2
BCAP EDC Guarantee for SMEs	Yes	\$	15.00	CAN	Subsidized_lending	TS1,TS2	ALL	ALL	2020-Q2
BCAP EDC MidMarket Guarantee and Financing Program	Yes	\$	15.00	CAN	Subsidized_lending	TS2	ALL	ALL	2020-Q2
Large Employer Emergency Financing Facility	Yes	\$	15.00	CAN	Subsidized_lending	TS3	ALL	ALL	2020-Q2
Canada Emergency Business Account	Yes	\$	18.75	CAN	Subsidized_lending	ALL	ALL	ALL	2020-Q2
Canada Emergency Wage Subsidy	Yes	\$	57.00	CAN	Consumer_spending	ALL	ALL	ALL	2020-Q2
Canada Emergency Response Benefit	No	\$	26.63	CAN	Consumer_spending	ALL	ALL	ALL	2020-Q2
Canada Emergency Student Benefit	Yes	\$	3.98	CAN	Consumer_spending	ALL	ALL	ALL	2020-Q2
Increasing Credit Availability to Agriculture and Food Processing	Yes	\$	3.75	CAN	Subsidized_lending	ALL	ALL	N02,N25	2020-Q2
Increasing the Canada Child Benefit	Yes	\$	1.43	CAN	Consumer_spending	ALL	ALL	ALL	2020-Q2
Cleaning up Orphan and Inactive Gas Wells	Yes	\$	1.28	CAN	Direct_grant	ALL	ALL	N40	2020-Q2

## Pandemic Credit Data and Analytics (PCDA)

#### **Projected Rating Migrations**



#### Segment Level Report

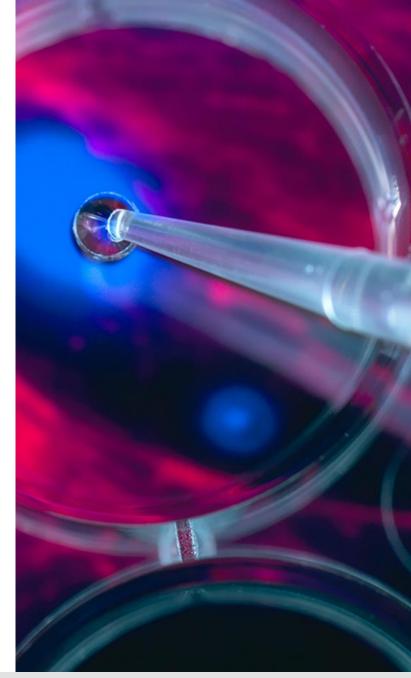


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## **Emerging Risks**

### Preparing for future unknowns

- » Navigating the uncertainty of COVID-19 is causing a re-evaluation of common risk factors.
- » Exposure to climate risk supply chain risk driven by common exposure to typhoon risks off the coast of Malaysia
- » Emerging concentration risks are shifting our views of geospatial dynamics
- » How can we design analytics to help us navigate this change?



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