"Can Time-Varying Risk of Rare Disasters Explain Aggregate Stock Market Volatility?"

by JESSICA WACHTER

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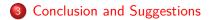
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Outline

Closely Related Literature and Contributions

2 The Degrees of Freedom: Calibrating Disasters• Which Disasters Matter?

- Time-Varying Probability of Disasters
- Calibrating Annual Consumption Disasters



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Rare Events and the Equity Premium:

- Rietz (1988), Barro (2006), Danthine-Donaldson (1999), Copeland-Zhu (2006), Gabaix (2007) ... \Rightarrow all calibration exercises
- Julliard and Ghosh (2008) (more on this later)

This paper's key ingredients:

- Recursive utility (e.g. Barro-Ursua (2008))
- 2 Time varying probability of disasters

Main new finding:

• match the observed volatility of stock returns thanks to the time variation in the probability of disasters (e.g. Gabaix (2007), with "linearity generating" processes and time-varying recovery rate of stocks in disasters)

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The key elements – annual consumption disasters size and probability – are calibrated as follows:

- Average probability of disasters: from the empirical frequency, under cross-country independence assumption
- Size of disasters: empirical distribution of multi-year cumulated GDP contractions (more on this later)
- Note: both as in Barro (2006) (Maddison (2003) data on 35 countries over the period 1900-2000)
 - Volatility of the disaster probability: chosen to match the volatility of returns. Any benchmark?

Remark: results extremely sensitive to the calibrated values – need to report more sensitivity analysis in the paper.

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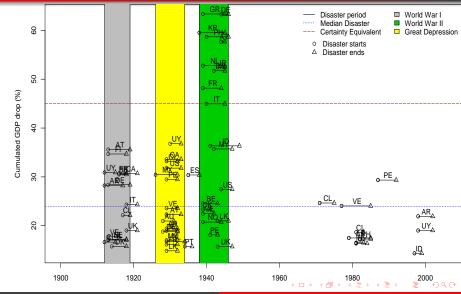
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Which Disasters Matter? Time-Varying Probability of Disasters Calibrating Consumption Disasters

Which Disasters Matter? Major 20th Century GDP Disasters



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Christian Julliard

Discussion of "Rare Disasters and Stock Market Volatility"

Which Disasters Matter? Time-Varying Probability of Disasters Calibrating Consumption Disasters

Remarks:

- Independence assumption clearly rejected
- ⇒ but small impact on key results
 - Results driven entirely by events in the largest 14% of disasters (e.g. 9 disaster 0.25% sample frequency)
- ⇒ dropping all other disasters reduces the equity premium by a mere 0.4%

- most extreme WWII events: invasions, nuclear/fire-bombings, civil wars. Do government bonds pay-off in these states? Calibration:
 60% of the time ⇒ stock excess return during disaster: -40.7%.
- But: in the data, during these events stocks outperform bonds by an average 4.51% (Source: Barro (2006))
 - In the data, it is only during the "smaller" 86% of disasters that bonds outperform stocks.
- But: using only these "smaller" disasters the model cannot match the equity premium (too small contractions).

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Which Disasters Matter? Time-Varying Probability of Disasters Calibrating Consumption Disasters

Market Returns and the Probability of Extreme Disasters

 Moreover, if time variation in the probability of <u>extreme</u> disasters is driving the volatility of returns, returns and risk premia should comove with the likelihood of these events.

A toy exercise: the "Doomsday Clock" (measures proximity to WWIII, biosecurity and climate change disasters. Source: *Bulletin of Atomic Scientists*, U-Chicago)

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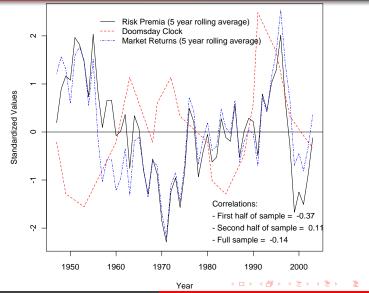
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Market Returns and the Probability of Extreme Disasters



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Discussion of "Rare Disasters and Stock Market Volatility"

Which Disasters Matter? Time-Varying Probability of Disasters Calibrating Consumption Disasters

Time-Varying Intensity of Disasters

• The time-varying intensity of (Poisson) disasters is modeled as

$$d\lambda_t = \underbrace{\kappa}_{=.145} \left(\underbrace{\bar{\lambda}}_{=.017} - \lambda_t \right) dt + \underbrace{\sigma_{\lambda}}_{=.07} \sqrt{\lambda_t} dB_t$$

- This is a strong amplifier mechanism of the relevance of disasters since:
 - the process can take unboundedly high values, and large values have non trivial probability endf of λ.
 - 2 when high values are reached, the process will tend to stay there for long (due to small κ) Simulated Time Path
- ⇒ Indeed, modest increases in RRA send the risk premium in the 3 digits range.
 - It would be nice to provide a real world benchmark for the process ⇒ Index Options?

Calibrating Consumption Disasters

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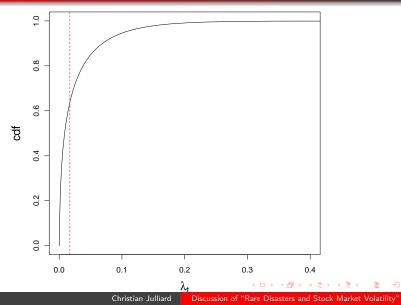
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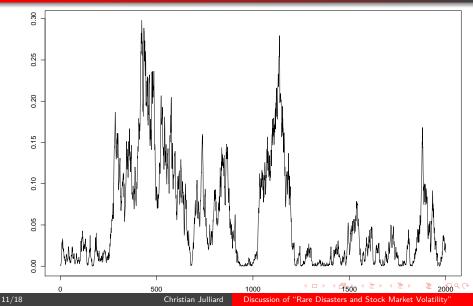
Which Disasters Matter? **Time-Varying Probability of Disasters** Calibrating Consumption Disasters

Cdf of λ_t



Which Disasters Matter? **Time-Varying Probability of Disasters** Calibrating Consumption Disasters

Simulated Time Path of λ_t



Which Disasters Matter? Time-Varying Probability of Disasters Calibrating Consumption Disasters

Calibrating Annual Consumption Disasters

This paper (as Barro (2006) and others):

- calibrates disasters in a yearly model using cumulated multi-year contractions (average length of disasters is 3.5-4 years)
 Durations Annualized Disasters
- ⇒ the framework delivers at most a 2.2% risk premium using annualized disasters (risk averse agents fear much more a one year disaster than the same contraction spread over several periods).

Lifetime Equivalent of One Disaster

- assumes that consumption drops by as much as GDP
- ⇒ Mixed evidence: 152 crises for GDP and 95 for C; <u>total</u> C declines proportionately more during wartime crises. (US Great Depression contraction: GDP 31%; non-durable Consumption 17%)

Which Disasters Matter? Time-Varying Probability of Disasters Calibrating Consumption Disasters

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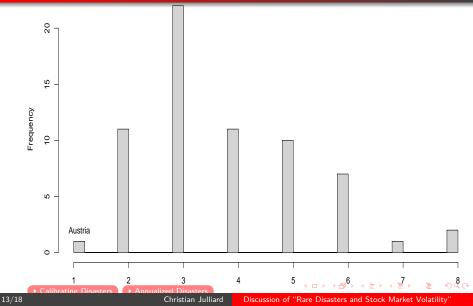
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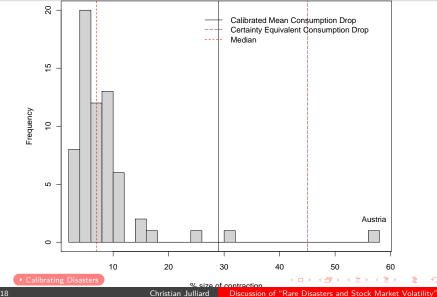
Which Disasters Matter? Time-Varying Probability of Disasters Calibrating Consumption Disasters

Duration of Disasters (in years)



Which Disasters Matter? Time-Varying Probability of Disasters Calibrating Consumption Disasters

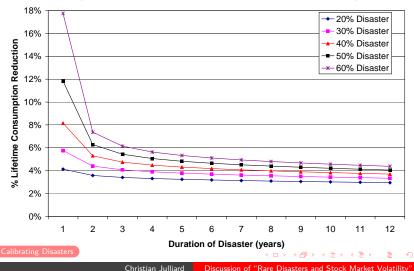
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Which Disasters Matter? Time-Varying Probability of Disasters Calibrating Consumption Disasters

Consumption Reduction Equivalent of One Disaster

Lifetime Consumption Reduction Equivalent of One Disaster (as a function of total disaster size and duration, CRRA=3)



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Which Disasters Matter? Time-Varying Probability of Disasters Calibrating Consumption Disasters

Discussion of "Rare Disasters and Stock Market Volatility"

A Counterfactual U.S. History

Consider:

- replacing the <u>four consumption data points</u> of the Great Depression period, with <u>one</u> calibrated disaster equal to the <u>cumulated GDP contraction</u> during the same period;
- applying the methodology of Julliard and Ghosh (2008) to this counterfactual 1929-2006 sample
- Note: in the true sample $\hat{\gamma} \ge 32$, the CCAPM is rejected, and under the rare events hypothesis the observed equity premium puzzle would be very unlikely to arise.

 Table 4: Estimation and Counterfactual EPP with Calibrated Disaster

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			DLL	DLILL	
Panel B. U.S. Gr	eat Depres	sion Cumu	lated GDP [Drop.	
	0.07		11 [6.3, 19.8]	11 [6.4, 19.7]	
$Pr\left(\gamma \leq 10 data ight)$			29.13%	28.71%	
$Pr\left(epp_{i}^{T}\left(\gamma ight) \geqepp^{T}\left(\gamma ight) ight)$	43.60%	43.30%	< • • • 7		≣ • ੧ <∂

Which Disasters Matter? Time-Varying Probability of Disasters Calibrating Consumption Disasters

A Counterfactual U.S. History

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Panel B. U.S. Great Depression Cumulated GDP Drop.						
$\hat{\gamma}$	11 (2.7)	11 (2.7)	11 [6.3, 19.8]	11 [6.4, 19.7]	_	
$\chi^2_{(1)}$	0.07 (.792)	0.07 (.784)				
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$\hat{\gamma}$	11 (2.7)	11 (2.7)	11 [6.3, 19.8]	11 [6.4, 19.7]		
$\chi^2_{(1)}$	0.07	0.07				
$Pr\left(\gamma \leq 10 data ight)$			29.13%	28.71%		
$Pr\left(epp_{i}^{T}\left(\gamma\right)\geqepp^{T}\left(\gamma\right)\right)$	43.60%	43.30%	<□ > <∂	→ = → + = → = =	গৎ	
Chri	Discussion o	f "Rare Disasters a	and Stock Market Volat	ility"		

Baseline:

- Well executed and innovative modeling of rare disasters.
- To accept the results at face value, one has to believe in Barro's calibration of disasters.

- needs some evidence on the link between time varying probability of disasters and market returns;
- extreme calibration of disasters could be avoided by adding learning (e.g. Geweke (2001), Weitzman (2007)). This would also:
 - generate an endogenous time variation in the perceived probability of disasters (e.g. Cogley-Sargent (2007));
 - deliver time-varying volatility and asymmetric volatility reaction to good and bad news (e.g. Veronesi (2004));
 - generate potential for sun-spot equilibria (e.g. Sandroni (1998)).

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