

# The sovereign default puzzle: A new approach to debt sustainability analysis

CEF 2013, Vancouver

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July 12, 2013

# Outline

- 1 Introduction
- 2 Calibrating sovereign debt models
- 3 A Lévy driven model of default
- 4 The full-fledged model
- 5 Policy implications for Europe
- 6 Conclusion and future work

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# Goals

- Need for models of debt sustainability analysis (DSA)
- Rich literature on the modeling of sovereign default, with both willingness and ability to repay taken into account
- Delivers rich theoretical insights and good quantitative fit for business cycles of emerging countries
- But fails at delivering realistic debt levels and default incidence, and therefore useless for DSA
- Goal of the present paper: make progress towards DSA-relevant and theoretically-grounded sovereign default models

## Canonical model (1/2)

- Tradition of Eaton and Gersovitz (1981), Cohen and Sachs (1986)
- Sovereign country (with representative agent) produces and consumes
- Production is an exogenous stochastic stream
- Difference between production and consumption financed on international markets  
⇒ accumulation of a stock of (short-term) external debt
- The country can make the strategic decision to default
- Default implies financial autarky and cost on output
- Anticipating default, international markets may impose a (model-consistent) risk premium or ration the country

## Canonical model (2/2)

- In case of repayment:

$$C_t^r = Q_t - D_t + \tilde{L}(Q_t, D_{t+1})$$

$$J^r(D_t, Q_t) = \max_{D_{t+1}} \left\{ u(Q_t - D_t + \tilde{L}(Q_t, D_{t+1})) + \beta \mathbb{E}_t J^*(D_{t+1}, Q_{t+1}) \right\}$$

- In case of default:

$$C_t^d = Q_t^d = (1 - \lambda)Q_t$$

$$J^d(Q_t) = u((1 - \lambda)Q_t) + \beta \mathbb{E}_t \left[ (1 - x)J^d(Q_{t+1}) + x J^*(0, Q_{t+1}) \right]$$

- Optimal choice between repayment and default:

$$J^*(D_t, Q_t) = \max\{J^r(D_t, Q_t), J^d(Q_t)\}$$

$$\tilde{\delta}'(D_t, Q_t) = \mathbb{1}_{J^r(D_t, Q_t) < J^d(Q_t)}$$

- Investors' zero profit condition (pins down the risk-adjusted interest rate):

$$(1 + r)\tilde{L}(Q_t, D_{t+1}) = \mathbb{E}_t \left[ 1 - \tilde{\delta}'(D_{t+1}, Q_{t+1}) \right] D_{t+1}$$

# Quantitative sovereign debt models

- Recent trend in the literature: match quantitative facts with these models (Aguiar and Gopinath, 2006; Arellano, 2008)
- Success for business cycle statistics of emerging countries
  - ▶ countercyclical current account
  - ▶ countercyclical interest rates
  - ▶ consumption more volatile than output
- But failure with respect to debt-to-GDP ratios and default probabilities!
  - ▶ either debt ratios too high and probability of default too low. . .
  - ▶ . . . or the contrary
  - ▶ consequence of the default cost assumed

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# The sovereign default puzzle

Paper	Main features	Debt-to-GDP mean ratio (%, annual)	Default probability (%, annual)
Arellano (2008)	Non-linear default cost	1	3.0
Aguiar & Gopinath (2006)	Shocks to GDP trend	5	0.9
Cuadra & Saprizza (2008)	Political uncertainty	2	4.8
Fink & Scholl (2011)	Bailouts and conditionality	1	5.0
Yue (2010)	Endogenous recovery	3	2.7
Mendoza & Yue (2011)	Endogenous default cost	6	2.8
Hatchondo & Martinez (2009)	Long-duration bonds	5	2.9
Benjamin & Wright (2009)	Endogenous recovery	16	4.4
Chatterjee & Eyigungor (2011)	Long-duration bonds	18	6.6
Roch & Uhlig (2013)	High default cost, sunspots	48	6.6

One would want:

- debt-to-GDP ratio of (at least) 40% of yearly GDP
- annual default probability of 3%

# Intuition for solving the puzzle

- In previous models, default frequency and debt levels both determined by a single parameter (cost of default), hence the trade-off  
⇒ need to disconnect the two
- Idea: defaults come *after* a crisis, not the other way round:
  - ▶ Default is a decision of the markets, not of the country
  - ▶ No such thing as “strategic default” (except Ecuador 2009)
  - ▶ Unfoldment of events: crisis ⇒ default ⇒ extra default costs
  - ▶ But extra default costs are lower than in “normal times”: the crisis “pre-pays” for the default
  - ▶ Makes it possible to have both high default frequencies and high debt levels
- Modeling tool for the eruption of a crisis: Poisson process

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# Lévy processes and default

- Brownian process: frequent and infinitesimally small jumps
- Poisson process: infrequent but discrete jumps
- Lévy processes:
  - ▶ Lévy process  $\simeq$  Brownian process + compound Poisson process
  - ▶ generalization in continuous time of random walks
- Theorem:
  - ▶ no default if output is a (discretized) Brownian process
  - ▶ Brownian motion analog to deterministic case
  - ▶ only the Poisson component generates defaults

## Discretized Lévy processes

$h$  is the length of a period (continuous time is  $h \rightarrow 0$ )

### The Cox-Ross-Rubinstein (CRR) case

$$Q_{t+h} = \begin{cases} e^{\sigma\sqrt{h}}Q_t & \text{with probability } \frac{1}{2} + \frac{\mu}{2\sigma}\sqrt{h} \\ e^{-\sigma\sqrt{h}}Q_t & \text{with probability } \frac{1}{2} - \frac{\mu}{2\sigma}\sqrt{h} \end{cases}$$

As  $h \rightarrow 0$ , converges towards geometric Brownian process of “percentage drift”  $\mu$  and “percentage volatility”  $\sigma$

### The Poisson case

$$Q_{t+h} = \begin{cases} Q_t & \text{with probability } e^{-p_0h} \\ k \cdot \tilde{m}_t Q_t & \text{with probability } 1 - e^{-p_0h} \end{cases}$$

where  $\tilde{m}$  has support in  $(0, 1)$  and  $k = \frac{p_0h}{1 - e^{-p_0h}}$ .

As  $h \rightarrow 0$ , converges towards geometric compound Poisson process (of rate  $p_0$  and jump size distribution  $\tilde{m}_t$ )

## Default with a Lévy process

- The rest of the model is like the canonical one (except that there is no possibility of redemption)
- Two polar cases for GDP: CRR or Poisson

### Theorem (no default in CRR)

In the CRR case, if  $h < \frac{1}{\left(\frac{\mu}{\sigma} + 4\sigma\right)^2}$ , only two cases are possible (for a given initial value of the debt-to-GDP ratio):

- the country immediately defaults;
- the country never defaults (whatever the future path of output).

### Theorem (default possible in Poisson)

In the Poisson case, the probability of default between dates  $t$  and  $t + 1$  is inferior to  $1 - e^{-p_0}$ . The upper bound is reached for some parameter combinations

# Simulating the model

Calibration, quarterly

Risk aversion	$\gamma$	2
Discount rate	$\rho$	$\log(0.8)$
Riskless interest rate	$r$	$\log(1.01)$
Loss of output in autarky (% of GDP)	$\lambda$	0.5%
Drift of CRR process	$\mu$	1%
Volatility of CRR process	$\sigma$	2.2%
Period size for which CRR and Poisson equivalent	$h_0$	4

In CRR, no default for  $h < h^* \simeq 3.4$  (almost one year)

# Simulating the model

## Results

Period duration ( $h$ , in quarters)	4	2	1	0.33
<i>CRR process</i>				
Default threshold (debt-to-GDP, quarterly, %)	48.4	51.9	68.8	79.3
Default probability in 10 years (%)	35.7	0.0	0.0	0.0
<i>Discretized Poisson process</i>				
Default threshold (debt-to-GDP, quarterly, %)	48.4	47.7	47.6	47.5
Default probability in 10 years (%)	35.1	34.6	34.3	40.0

- Simulation results confirm the theoretical ones
- Note: does not aim at reproducing quantitative facts



# Does this generalize to continuous time?

- Ongoing work with Sylvain Carré
- Preliminary answer: no
- But this is because of pathological reasons: a (geometric) Brownian process can go to 0 almost instantly
- Highly improbable events, so the default probability must still be very small
- Quantification work to come

# Typology of debt crises

- 1 Failure to adjust in real time to a smooth shock  
⇒ the solution is to have a more efficient monitoring of intra-annual deficit (when  $\mu/\sigma \simeq 1$ , the time window is one month)
- 2 A discontinuous shock  
⇒ this is the real challenge

Previous models did not take this distinction into account.

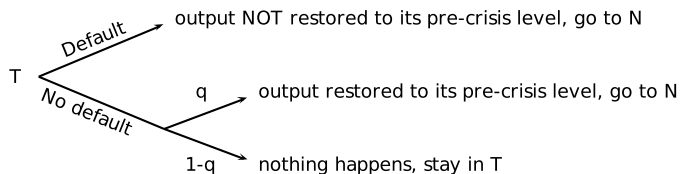
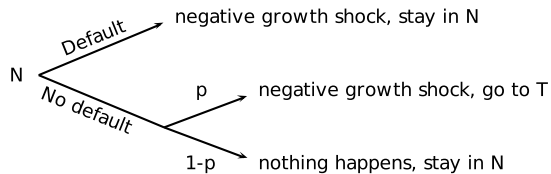
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# Model outline

- Growth has a Brownian and a Poisson component
- Brownian component = usual business cycle AR(1) process
- Poisson component = exogenous risk of being hit by a confidence shock which has real and lasting negative consequences
- Confidence can be restored if no default during crisis  
⇒ markets act like a “trembling hand”
- Regime switching model in the spirit of Hamilton (1989)
- Recovery value for investors in case of default  
⇒ raises sustainable debt-levels

# Law of motion of the economy



$N$  is “normal times”,  $T$  is “trembling times”

$p$  is the probability of a confidence shock,  $q$  that of a confidence restoration

# The growth rate

Growth equal to:

$$g_t = e^{y_t} + z_t$$

Brownian component:

$$y_t = \mu_y + \rho_y(y_t - \mu_y) + \varepsilon_t \quad \varepsilon_t \rightsquigarrow \mathcal{N}(0, \sigma_y^2)$$

Poisson component: ( $\mu_z$  is the size of the shock on impact)

State in $t - 1$	If repayment in $t - 1$	If default in $t - 1$
Normal ( $N$ )	$\begin{cases} z_t = \rho_z z_{t-1} & \text{prob. } 1 - p \\ z_t = \rho_z z_{t-1} - \mu_z & \text{prob. } p \end{cases}$	$z_t = \rho_z z_{t-1} - \mu_z$
Trembling ( $T$ )	$\begin{cases} z_t = \rho_z z_{t-1} & \text{prob. } 1 - q \\ z_t = \rho_z z_{t-1} + \mu_z & \text{prob. } q \end{cases}$	$z_t = \rho_z z_{t-1}$

# Calibration

Risk aversion	$\gamma$	2
Discount factor	$\beta$	0.95
World riskless interest rate	$r$	1%
Probability of settlement after default	$x$	10%
Loss of output in autarky (% of GDP)	$\lambda$	2%
Probability of entering “trembling times”	$p$	1.5%
Probability of exiting “trembling times”	$q$	5%
Recovery value (% of yearly GDP)	$V$	25%
Size of “Poisson” shock to growth	$\mu_z$	1%
Auto-correlation of “Poisson” component of growth	$\rho_z$	0.8
Mean of “Brownian” component of growth	$\mu_g$	1.006
Standard deviation of “Brownian” component of growth	$\sigma_y$	3%
Auto-correlation of “Brownian” component of growth	$\rho_y$	0.17

# Resolution method

- State space of dimension 3:  $(D, y, z)$
- 4 value functions: default versus repayment, normal versus trembling times
- Special care has been given to the numerical solution, given the problems raised by Hatchondo et al. (RED, 2010)
- Value function iteration too slow (curse of dimensionality) and imprecise
- Use of an extension of the endogenous grid method
- For more details, see Villemot (2012)

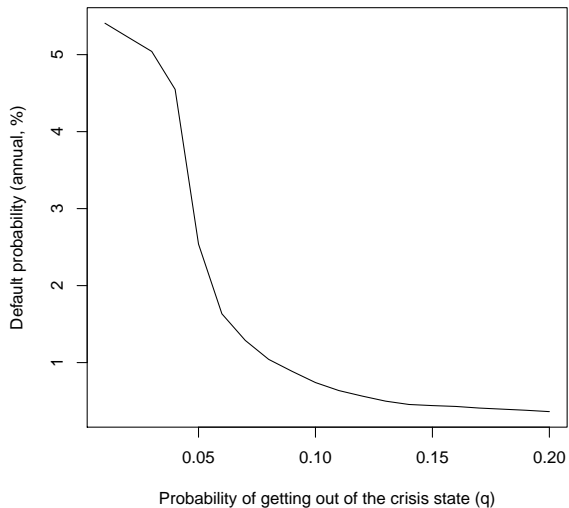


## Simulated moments

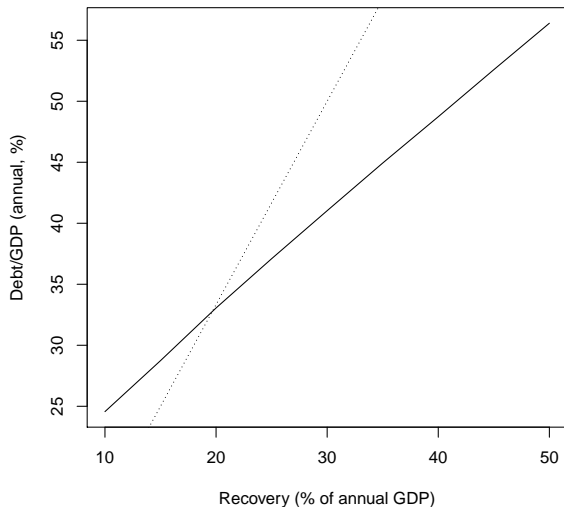
	Benchmark	With no Poisson
Rate of default (% , per year)	2.50	0.26
Mean debt output ratio (% , annualized)	38.17	46.82
$\sigma(Q)$ (%)	4.45	4.42
$\sigma(C)$ (%)	6.04	6.89
$\sigma(TB/Q)$ (%)	2.63	3.47
$\sigma(\Delta)$ (%)	0.57	0.18
$\rho(C, Q)$	0.92	0.89
$\rho(TB/Q, Q)$	-0.41	-0.49
$\rho(\Delta, Q)$	-0.60	-0.41
$\rho(\Delta, TB/Q)$	0.64	0.90

$TB$  = trade balance,  $\Delta$  = risk premium

# Default probability, as a function of $q$



# Mean debt-to-GDP as a function of recovery $V$



# Self-fulfilling reinterpretation

- When  $q$  is low, Poisson shocks always trigger a default
- A self-fulfilling reinterpretation becomes possible, à la Cole and Kehoe (1996, 2000)
- Suppose two equilibria are possible:
  - ▶ a “bad” equilibrium where investors think the country will default and whose panic destroy the country’s fundamental, self-fulfillingly making the country default
  - ▶ a “good” equilibrium, where investors think that the country will repay and where the country therefore repays
- For low values of  $q$ , the Poisson shock can therefore be reinterpreted as a sunspot, triggering the coordination on the “bad” equilibrium

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## Analysis at business cycle frequencies

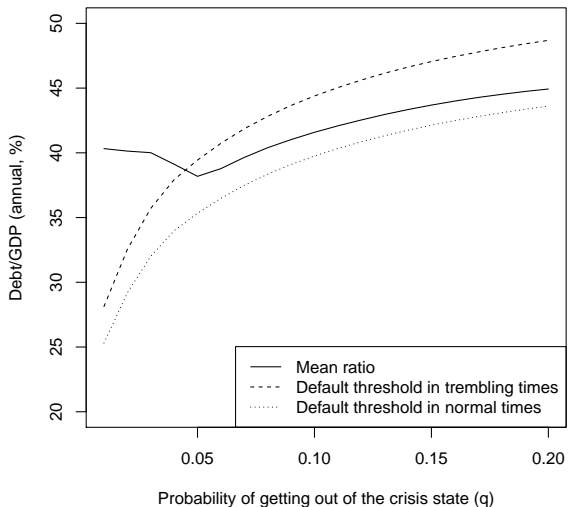
- Assume here that the switch between normal and trembling times corresponds to the business cycle
- Hamilton (1989) on US data for 1952–1984:  
 $p = 9.5\%$  and  $q = 24.5\%$
- Goodwin (1993) on 8 advanced economies for 1960–2000:  
 $p \in [1\%, 9\%]$ ,  $q \in [21\%, 49\%]$
- Model simulations:

$p$ (quarterly)	1%	1%	10%	10%
$q$ (quarterly)	20%	50%	20%	50%
Rate of default (yearly)	0.38%	0.27%	0.32%	0.29%
Mean $D/Q$ (annualized)	45%	47%	43%	46%

⇒ trembling times for debt crises are less frequent and more severe downturns than are business cycles downturns

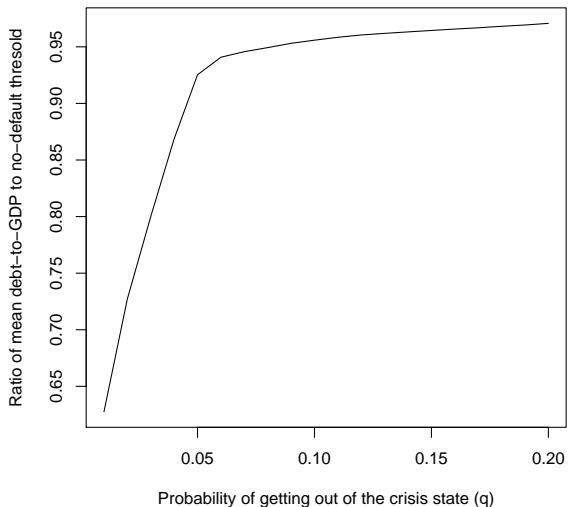
# Mean debt-to-GDP and credit ceilings

As function of  $q$



# Credit ceilings

As a fraction of equilibrium levels in normal times





# Welfare costs of imposing credit ceilings

Calculation à la Lucas (1987)

$q$ (quarterly)	1%	5%	10%	20%
Unconstrained welfare	-18.273	-18.510	-18.524	-18.570
Constrained welfare	-18.573	-18.581	-18.578	-18.573
Cost of ceiling (as a permanent GDP loss)	1.64%	0.39%	0.30%	0.02%

- Lucas (2003): cost of fluctuations  $\simeq 0.1\%$  of GDP
- Cost insignificant for large  $q$
- But large for low  $q$

⇒ ceilings may be worth a try for intermediate  $q$  if default has systemic importance

## Other remarks

- Size of the Poisson shock ( $\mu_z$ )
  - ▶ benchmark (with emerging countries in mind): GDP level permanently lowered by 3.8%
  - ▶ This is big, but not so compared to the Greek case
  - ▶ For eurozone, the cost may be higher (due to monetary union)
  - ▶ The model can then deliver higher sustainable debt levels
- Sovereign debt held by foreigners:
  - ▶ 70% for Greece, Portugal, Ireland
  - ▶ But very low for Japan
  - ▶ Policy lesson: have debt held by domestic entities
  - ▶ Not captured by our model, but would be an interesting extension

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# Conclusion

- A critical parameter: the speed at which the country exits from “trembling times”
- Rapid reaction from policymakers is needed
- Credit ceilings should be contingent and can be costly in terms of welfare
- The mess created by the management of the eurozone crisis probably changed the perception that markets have of this ability to react  
⇒ raised default risk

# Future work

- Improve understanding (and possibly modelling) of recovery parameter  $q$
- Develop a support tool for debt sustainability analysis
  - ▶ Based on the trembling times model
  - ▶ Requires empirical work on cross-country data as input
  - ▶ Would permit to create calibrations for various country profiles
- Incorporate endogenous and theoretically-grounded sovereign risk premium into standard NK models
  - ▶ Standard NK ingredients (nominal side to be as second step)
  - ▶ Distinction between domestic and foreign sovereign debt
  - ▶ Welfare-maximizing social planner vs fiscal rule
  - ▶ Necessity to improve on solution algorithms

# Thanks for your attention!

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