# Linkages Across Sovereign Debt Markets 

Cristina Arellano and Yan Bai

Federal Reserve Bank of Minneapolis and University of Rochester

Jacques Polak Annual Research Conference

November 2014

## Motivation

- Theory of sovereign default studies countries in isolation
- Sovereign debt crises happen in bunches


## Percentage of Countries in Default



Source: Reinhart and Rogoff 2011

## European Debt Crisis

- Default fears: Greece, Ireland, Italy, Portugal, Spain
- Interest rate spreads co-move
- Lending banks at the center of crisis
- Banks' exposure to GIIPS seen as a major concern
- In German banks, loans to GIIPS are 130\% of their capital


## Spreads



## This Paper

- Dynamic multicountry model of sovereign debt linkages
- Countries borrow, default, and renegotiate with common lenders
- Countries default together because
- Renegotiating together lowers debt recovery
- Rolling over debt is more expensive


## This Paper

- Dynamic multicountry model of sovereign debt linkages
- Countries borrow, default, and renegotiate with common lenders
- Countries default together because
- Renegotiating together lowers debt recovery
- Rolling over debt is more expensive
- Predictions consistent with historical cross-country data
- Default probabilities higher when others default
- Renegotiation probabilities higher when others renegotiate
- Recovery rates lower when others renegotiate
- Model accounts for $50 \%$ of spread correlation across GIIPS


## Literature

- Sovereign default and renegotiation in single countries:

Eaton \& Gersovitz (1981), Arellano (2008), Yue (2010), Benjamin \& Wright (2011)

Here multiple countries linked through debt markets

- Risk premia in sovereign bonds market: Borri and Verdelhan (2010), Presno and Pouzo (2012), Gilchrist, Yue, and Zakrajsek (2012)

Here risk premium endogenous to countries' choices

- Contagion in capital flows through common lender: Calvo and Mendoza (2000), Kyle and Xiong (2001)

Here contagion through default choices

- Default and contagion: Lizarazo (2010), Park (2012)

Here strategic interactions among countries and renegotiation

## Simple Model

- Two periods no-uncertainty
- Two borrowing countries and continuum of lenders
- Countries are strategic big players; lenders are competitive
- Countries differ in initial debt $b=\left\{b_{1}, b_{2}\right\}$
- Countries borrow, default, and renegotiate
- Default entails costs: output and autarky


## Borrowing Countries: Consumption

Period 1: Countries decide whether to repay or default

- If repay $\left(d_{i}=0\right)$, borrow

$$
c_{i}=y-b_{i}+\underbrace{q_{i}\left(b, d, b^{\prime}\right)}_{\text {bond price }} b_{i}^{\prime}
$$

- If default $\left(d_{i}=1\right)$, output loss and not borrow

$$
c_{i}=y^{d}
$$

## Borrowing Countries: Consumption

Period 1: Countries decide whether to repay or default

- If repay $\left(d_{i}=0\right)$, borrow

$$
c_{i}=y-b_{i}+\underbrace{q_{i}\left(b, d, b^{\prime}\right)}_{\text {bond price }} b_{i}^{\prime}
$$

- If default $\left(d_{i}=1\right)$, output loss and not borrow

$$
c_{i}=y^{d}
$$

Period 2: Pay debt or recovery

- Non-defaulters pay debt: $c_{i}^{\prime}=y^{\prime}-b_{i}^{\prime}$
- Defaulters renegotiate

$$
c_{i}^{\prime}=y^{\prime}-\underbrace{\phi_{i}\left(d, b^{\prime}\right)}_{\text {recovery }}
$$

## Borrowing Countries: Consumption

Period 1: Countries decide whether to repay or default

- If repay $\left(d_{i}=0\right)$, borrow

$$
c_{i}=y-b_{i}+\underbrace{q_{i}\left(b, d, b^{\prime}\right)}_{\text {bond price }} b_{i}^{\prime}
$$

- If default $\left(d_{i}=1\right)$, output loss and not borrow

$$
c_{i}=y^{d}
$$

Period 2: Pay debt or recovery

- Non-defaulters pay debt: $c_{i}^{\prime}=y^{\prime}-b_{i}^{\prime}$
- Defaulters renegotiate

$$
c_{i}^{\prime}=y^{\prime}-\underbrace{\phi_{i}\left(d, b^{\prime}\right)}_{\text {recovery }}
$$

Countries are linked through bond price and recovery

## Borrowing Countries: Default Decision

- Country $i$ defaults if default value higher than repaying value

$$
u\left(y-b_{i}+q_{i}\left(b, d_{-i}\right) \bar{b}\right)+\beta u\left(y^{\prime}-\bar{b}\right)<u\left(y^{d}\right)+\beta u\left(y^{\prime}-\phi_{i}\left(d_{-i}\right)\right)
$$

- If repay borrow to limit: $\bar{b}=y^{\prime}-y^{d}$
- States and choices of other country affects $\phi_{i}^{\prime}$ and $q_{i}$
- Low $\phi_{i}$ and low $q_{i}$ increase default incentives
- Default is more likely when $b_{i}$ is high
- Default cutoff $\hat{b}_{i}\left(b_{-i}, d_{-i}\right)$

$$
d_{i}=1 \quad \text { if } b_{i} \geq \hat{b}_{i}\left(b_{-i}, d_{-i}\right)
$$

## Recovery Functions

- Simultaneous renegotiation with generalized Nash Bargaining
- One country defaults and renegotiates

$$
\max _{\phi_{i}}\left[u\left(y^{\prime}-\phi_{i}\right)-u\left(y^{d}\right)\right]^{\theta}\left[u^{L}\left(y_{L}+\bar{b}+\phi_{i}\right)-u^{L}\left(y_{L}+\bar{b}\right)\right]^{1-\theta}
$$

## Recovery Functions

- Simultaneous renegotiation with generalized Nash Bargaining
- One country defaults and renegotiates

$$
\max _{\phi_{i}}\left[u\left(y^{\prime}-\phi_{i}\right)-u\left(y^{d}\right)\right]^{\theta}\left[u^{L}\left(y_{L}+\bar{b}+\phi_{i}\right)-u^{L}\left(y_{L}+\bar{b}\right)\right]^{1-\theta}
$$

- Two countries default and renegotiate

$$
\max _{\phi_{1}, \phi_{2}}\left[u\left(y^{\prime}-\phi_{1}\right)-u\left(y^{d}\right)\right]^{\theta}\left[u\left(y^{\prime}-\phi_{2}\right)-u\left(y^{d}\right)\right]^{\theta}\left[u^{L}\left(y_{L}+\phi_{1}+\phi_{2}\right)-u^{L}\left(y_{L}\right)\right]^{1-\theta}
$$

## Recovery Functions

- Simultaneous renegotiation with generalized Nash Bargaining
- One country defaults and renegotiates

$$
\max _{\phi_{i}}\left[u\left(y^{\prime}-\phi_{i}\right)-u\left(y^{d}\right)\right]^{\theta}\left[u^{L}\left(y_{L}+\bar{b}+\phi_{i}\right)-u^{L}\left(y_{L}+\bar{b}\right)\right]^{1-\theta}
$$

- Two countries default and renegotiate

$$
\max _{\phi_{1}, \phi_{2}}\left[u\left(y^{\prime}-\phi_{1}\right)-u\left(y^{d}\right)\right]^{\theta}\left[u\left(y^{\prime}-\phi_{2}\right)-u\left(y^{d}\right)\right]^{\theta}\left[u^{L}\left(y_{L}+\phi_{1}+\phi_{2}\right)-u^{L}\left(y_{L}\right)\right]^{1-\theta}
$$

- Lenders' outside option lower when both countries renegotiate


## Recovery Functions

- Simultaneous renegotiation with generalized Nash Bargaining
- One country defaults and renegotiates

$$
\max _{\phi_{i}}\left[u\left(y^{\prime}-\phi_{i}\right)-u\left(y^{d}\right)\right]^{\theta}\left[u^{L}\left(y_{L}+\bar{b}+\phi_{i}\right)-u^{L}\left(y_{L}+\bar{b}\right)\right]^{1-\theta}
$$

- Two countries default and renegotiate

$$
\max _{\phi_{1}, \phi_{2}}\left[u\left(y^{\prime}-\phi_{1}\right)-u\left(y^{d}\right)\right]^{\theta}\left[u\left(y^{\prime}-\phi_{2}\right)-u\left(y^{d}\right)\right]^{\theta}\left[u^{L}\left(y_{L}+\phi_{1}+\phi_{2}\right)-u^{L}\left(y_{L}\right)\right]^{1-\theta}
$$

- Lenders' outside option lower when both countries renegotiate
- Joint renegotiation $\Rightarrow$ recovery lower $\Rightarrow$ defaults more, $\Rightarrow \hat{b}_{i}$ tighter


## Bond Price Functions

- Prices solve lenders' demand system
- Two countries repay

$$
q_{i}=\delta \frac{u_{L}^{\prime}\left(y_{L}+2 \bar{b}\right)}{u_{L}^{\prime}\left(y_{L}+b_{i}-q_{i} \bar{b}+b_{-i}-q_{-i} \bar{b}\right)}
$$

- Price $q_{i}$ increases with repayment of large $b_{-i}$
- Foreign defaults

$$
q_{i}=\delta \frac{u_{L}^{\prime}\left(y_{L}+2 \bar{b}\right)}{u_{L}^{\prime}\left(y_{L}+b_{i}-q_{i} \bar{b}\right)}
$$

- Foreign repays small $b_{-i} \Rightarrow \hat{b}_{i}$ tighter


## Best Responses



## Best Responses



In dependency zone, foreign default leads to home default

## Equilibrium



## Equilibrium: Zones



## Main Predictions Simple Model

- Default more when others default
- Renegotiate more when others renegotiate
- Recovery lower with joint renegotiation


## Cross Country Data

|  | Default | Renegotiation | Recovery |
| :--- | :--- | :--- | :--- |
| Fraction in Default $_{\text {it }}$ | $1.36^{* * *}$ | $-0.88^{* * *}$ | $0.92^{* * *}$ |
| Fraction Renegotiating $_{\text {it }}$ | $-2.13^{*}$ | $4.60^{* *}$ | $-7.39^{* * *}$ |
| Debt/GDP ${ }_{i t}$ | $0.11^{* *}$ | $-0.03^{*}$ | $-0.21^{* * *}$ |
| Country fixed effects | Yes | Yes | No |
|  |  |  |  |
| Adjusted $R^{2}$ | 0.28 | 0.06 | 0.34 |
| Observations | 2682 | 552 | 139 |

Dataset of 77 countries 1970-2011 from S\&P and Cruces and Trebesch (2013)

- Theory predictions are consistent with historical data


## Quantitative Model

- Infinite horizon and stochastic income
- Time varying debt and default choices
- Spreads compensates for expected default loss
- Same strategic interactions for default and renegotiation
- Markov equilbirum:
- Optimal choices for default, renegotiation, and debt are Nash
- Bond price and recovery functions are consistent with default and renegotiation decisions
- Equilibrium selection: Outcome that maximizes country values


## Quantitative analysis

- Use data from Greece, Italy, Spain, and historical debt recoveries to parameterize model
- Model can account for half of the correlation in spreads and debt exposures across countries
- Strategic interactions and joint renegotiations are most important forces


## Model and Data

Data Model

| Calibrated moments (\%) |  |  |
| :--- | :---: | :---: |
| Mean risk free rate | 4.0 | 4.2 |
| Mean spread | 1.4 | 1.6 |
| Volatility risk free rate | 1.4 | 1.6 |
| Volatility spread | 2.6 | 1.8 |
| Volatility exposure | 15 | 16 |
| Mean recovery | 60 | 66 |
| $\Delta$ in recovery | -16 | -13 |
| with multiple rene. |  |  |


| Other moments |  |  |
| :--- | :--- | :--- |
| Correlation of spread | 0.97 | 0.43 |
| Correlation of exposure | 0.56 | 0.30 |

## Debt Linkages

|  | Overall | Foreign Good Credit |  |  | Foreign Bad Credit |  |
| :--- | :---: | :---: | :---: | :--- | :---: | :---: |
| Home | Mean | Repay | Default |  | Rene. | Nonrene. |
|  |  |  |  |  |  |  |
| Default prob. | 4.5 | 2.9 | 37.3 |  | 0.03 | 100 |
| Rene. prob. | 98 | 100 | 1 |  | 100 | - |
| Recovery | 66 | 71 | 90 |  | 58 | - |
| Spread | 1.6 | 1.6 | 1.9 |  | 1.1 | - |

- Default more when others default or do not renegotiate
- Renegotiate more when others repay or renegotiate
- Recovery is reduced when others repay or renegotiate


## What Drives Results?

|  | Benchmark | Decomposing Mechanism |  |  | Correlated |
| :--- | :---: | :---: | :---: | :---: | :---: |
|  |  | Linear | Low IES | Small |  |
| Shocks |  |  |  |  |  |

## What Drives Results?

|  | Benchmark | Decomposing Mechanism |  |  | Correlated |
| :--- | :---: | :---: | :---: | :---: | :---: |
|  |  | Linear | Low IES | Small |  |
| Shocks |  |  |  |  |  |

Strategic interactions are most important force

## Conclusion

- Developed a model of sovereign debt linkages
- Defaults and renegotiations are correlated
- Strategic interactions of countries trading with common lenders


## Parameters

$$
u(c)=\frac{c^{1-\sigma}}{1-\sigma}, \quad g\left(c_{L}\right)=\frac{c_{L}^{1-\alpha}}{1-\alpha}
$$

Uncorrelated $\operatorname{AR}(1)$ shock process from Greek GDP $\rho=0.88$, $\eta=0.03$
Borrowers' risk aversion $\sigma=2$

|  | Value | Target |
| :---: | :---: | :---: |
| Lender's income | $y_{L}=1.4$ | German yield: mean and vol |
| Lender's risk aversion | $\alpha=0.65$ | Greek spread: |
| Lender's discount factor | $\delta=0.96$ | Greek spread: <br> mean and vol. |
| Output cost after default | $\lambda=0.016$ | Recovery rate |
| Borrowers' discount factor | $\beta=0.82$ | Recovery rate <br> mean and cond. |
| Borrower's bargaining power | $\theta=0.38$ | Exposure vol. |

## Borrowers Countries: Payoffs

Consumption and expected value for arbitrary strategy $\left(d, b^{\prime}\right)$

$$
w_{i}\left(s, d, b^{\prime}\right)=u\left(c_{i}\left(s, d, b^{\prime}\right)\right)+\beta \sum \pi\left(y^{\prime}, y\right) v_{i}\left(s^{\prime}\left(d, b^{\prime}\right)\right)
$$

- $v_{i}$ : future value given by the Markov allocations
- $w_{i}$ : payoff for arbitrary strategies $\left(d, b^{\prime}\right)$
- Future state $s^{\prime}=\left(b^{\prime}, h^{\prime}, y^{\prime}\right)$ induced by strategies $\left(d, b^{\prime}\right)$


## Borrowing Countries: Stages of Game

Each period has two sequential stages:

- Default-renegotiation stage

Countries decide on $d_{i}$ : repay/default or renegotiate/not

- Borrowing stage: given states $(s, d)$

Non-defaulting countries decide on borrowing $b^{\prime}$
Cournot competition

We consider Markov equilibrium

## Borrowers Countries: Borrowing Stage

- Borrowing determined by Cournot competition
- Borrowing best response of country $i$

$$
x_{i}^{b}\left(b_{-i}^{\prime}, s, d\right)=\left\{b_{i}^{\prime}: \max _{b_{i}^{\prime}} w_{i}\left(s, d, b^{\prime}\right)\right\}
$$

- Optimal borrowing $\left(B_{1}(s, d), B_{2}(s, d)\right)$ is Nash

$$
B_{i}(s, d)=x_{i}^{b}\left(B_{-i}(s, d), s, d\right) \quad \text { for all } i
$$

## Borrowers Countries: Default-Renegotiation Stage

- Optimal default and renegotiation is Nash
- Default-renegotiation best response of country $i$

$$
x_{i}^{d}\left(d_{-i}, s\right)=\left\{d_{i}: \max _{d_{i}} w_{i}(s, d, B(s, d))\right\}
$$

- Optimal default-renegotiation strategy $\left(D_{1}(s), D_{2}(s)\right)$

$$
D_{i}(s)=x_{i}^{d}\left(D_{-i}(s), s\right)
$$

- Markov equilibrium given price and recovery functions

$$
v_{i}(s)=w_{i}(s, D(s), B(s, D(s)))
$$

## Lenders

- Competitive with preferences: $E \sum_{t=0}^{\infty} \delta^{t} g\left(c_{L t}\right)$
- More patient than borrowers $\delta>\beta$, dislike volatility $g^{\prime \prime}()<$.
- Dividends depend on credit phases and countries' choices

$$
c_{L}=y_{L}+\sum_{i=1}^{2} \underbrace{\left[1-D_{i}(s)\right]\left[\left(1-h_{i}\right)\left(b_{i}-Q_{i}(s) b_{i}^{\prime}\right)+h_{i} \Phi_{i}(s)\right]}_{\text {net repayment from country } i}
$$

- $Q_{i}(s)$ is prices of bonds; $\Phi_{i}(s)$ is the recovery


## Lenders FOC

- Lenders' kernel

$$
m\left(s^{\prime}, s\right)=\frac{\delta \pi\left(y^{\prime}, y\right) g^{\prime}\left(c_{L}\left(s^{\prime}\right)\right)}{g^{\prime}\left(c_{L}(s)\right)}
$$

- Price of bonds

$$
Q(s)=E m\left(s^{\prime}, s\right)\left[\left(1-D\left(s^{\prime}\right)\right)+D\left(s^{\prime}\right) \zeta\left(s^{\prime}\right)\right]
$$

- Risk adjusted present value of recovery rate

$$
\zeta(s)=E\left[m\left(s^{\prime}, s\right)\left(1-D\left(s^{\prime}\right)\right) \frac{\Phi\left(s^{\prime}\right)}{b^{\prime}}+D\left(s^{\prime}\right) \zeta\left(s^{\prime}\right)\right]
$$

## Bond price schedule



- Price tight with foreign default, high borrowing, and not renegotiate


## Recovery schedule



- Recovery low in joint renegotiations

