A Quantitative Analysis of the Countercyclical Capital Buffer

Miguel Faria-e-Castro Federal Reserve Bank of St. Louis

CCyB Workshop
Central Bank of Chile, January 2024

- Modern macroprudential regulation based on (i) capital and (ii) liquidity regulation
- Basel II: pre-2008 capital regulation

$$\mathsf{Bank}\ \mathsf{Capital}_t \geq \kappa \times \mathsf{Bank}\ \mathsf{Assets}_t$$

Basel III: introduces the Countercyclical Capital Buffer (CCyB)

$$\mathsf{Bank} \; \mathsf{Capital}_t \geq \kappa(\mathbb{S}_t) imes \mathsf{Bank} \; \mathsf{Assets}_t$$

where S_t is the state of the economy

- BIS: raise κ during periods of "excess aggregate credit growth"
- Active in Australia, Germany, HK, Sweden, UK

- 1. What are the quantitative effects of the CCyB?
- 2. Could the CCyB have prevented a 2008-like crisis in the US?

- Modern macroprudential regulation based on (i) capital and (ii) liquidity regulation
- Basel II: pre-2008 capital regulation

$$\mathsf{Bank}\ \mathsf{Capital}_t \geq \kappa \times \mathsf{Bank}\ \mathsf{Assets}_t$$

Basel III: introduces the Countercyclical Capital Buffer (CCyB)

$$\mathsf{Bank} \; \mathsf{Capital}_t \geq \kappa(\mathbb{S}_t) imes \mathsf{Bank} \; \mathsf{Assets}_t$$

where S_t is the state of the economy

- BIS: raise κ during periods of "excess aggregate credit growth"
- Active in Australia, Germany, HK, Sweden, UK

- 1. What are the quantitative effects of the CCyB?
- 2. Could the CCyB have prevented a 2008-like crisis in the US?

- Modern macroprudential regulation based on (i) capital and (ii) liquidity regulation
- Basel II: pre-2008 capital regulation

Bank Capital_t
$$\geq \kappa \times \text{Bank Assets}_t$$

Basel III: introduces the Countercyclical Capital Buffer (CCyB)

Bank Capital_t
$$\geq \kappa(\mathbb{S}_t) \times \mathsf{Bank} \; \mathsf{Assets}_t$$

where \mathbb{S}_t is the state of the economy

- BIS: raise κ during periods of "excess aggregate credit growth"
- Active in Australia, Germany, HK, Sweden, UK

- 1. What are the quantitative effects of the CCyB?
- 2. Could the CCyB have prevented a 2008-like crisis in the US?

- Modern macroprudential regulation based on (i) capital and (ii) liquidity regulation
- Basel II: pre-2008 capital regulation

Bank Capital_t
$$\geq \kappa \times \text{Bank Assets}_t$$

Basel III: introduces the Countercyclical Capital Buffer (CCyB)

Bank Capital_t
$$\geq \kappa(\mathbb{S}_t) \times \mathsf{Bank} \; \mathsf{Assets}_t$$

where \mathbb{S}_t is the state of the economy

- BIS: raise κ during periods of "excess aggregate credit growth"
- Active in Australia, Germany, HK, Sweden, UK

- 1. What are the quantitative effects of the CCyB?
- 2. Could the CCyB have prevented a 2008-like crisis in the US?

Approach and Results

- 1. Nonlinear model of endogenous financial crises
 - Economy endogenously enters and exits crisis regions
 - Crises trigger "aggregate demand" recessions
 - Scope for macroprudential regulation
 - Rich interactions between household and bank balance sheets
- 2. Quantitative exercise
 - Calibrate model to the US pre-GFC
 - Use Model + Data to estimate shocks under Basel II (no CCyB)
 - Counterfactual: Crisis and Great Recession under Basel III (CCyB
- Results
 - (a) CCyB: freq. crises ↓ by 75% (ex-ante), worsens severity ex-post
 - (b) Crisis severity can be attenuated with a "CCyB Release" policy
 - (c) CCyB prevents crisis in 2008 (but not subsequent recession)
 - (d) Intervention may not be needed in equilibrium

Approach and Results

- 1. Nonlinear model of endogenous financial crises
 - Economy endogenously enters and exits crisis regions
 - Crises trigger "aggregate demand" recessions
 - Scope for macroprudential regulation
 - Rich interactions between household and bank balance sheets

2. Quantitative exercise

- Calibrate model to the US pre-GFC
- Use Model + Data to estimate shocks under Basel II (no CCyB)
- Counterfactual: Crisis and Great Recession under Basel III (CCyB)

Results

- (a) CCyB: freq. crises ↓ by 75% (ex-ante), worsens severity ex-post
- (b) Crisis severity can be attenuated with a "CCyB Release" policy
- (c) CCyB prevents crisis in 2008 (but not subsequent recession)
- (d) Intervention may not be needed in equilibrium

Approach and Results

- 1. Nonlinear model of endogenous financial crises
 - Economy endogenously enters and exits crisis regions
 - Crises trigger "aggregate demand" recessions
 - Scope for macroprudential regulation
 - Rich interactions between household and bank balance sheets

2. Quantitative exercise

- Calibrate model to the US pre-GFC
- Use Model + Data to estimate shocks under Basel II (no CCyB)
- Counterfactual: Crisis and Great Recession under Basel III (CCyB)

Results

- (a) CCyB: freq. crises ↓ by 75% (ex-ante), worsens severity ex-post
- (b) Crisis severity can be attenuated with a "CCyB Release" policy
- (c) CCyB prevents crisis in 2008 (but not subsequent recession)
- (d) Intervention may not be needed in equilibrium

Relation to the Literature

1. **Basel II**: What is the optimal <u>level</u> of capital requirements?

Van den Heuvel (2008), Nguyen (2014), Martinez-Miera and Suarez (2014), Begenau (2015), Landvoigt and Begenau (2016)

Basel III: How should capital requirements <u>change</u> with the state of the economy?
 Karmakar (2016), Davidyuk (2017), Elenev, Landvoigt, and Van Nieuwerburgh (2018), Mendicino, Nikolov, Suarez, and Supera (2018)

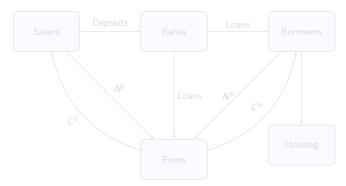
This paper: Quantitative (positive) analysis of current CCyB framework.

- Gertler, Kiyotaki, and Prestipino (2018): bank runs in a DSGE model
- Faria-e-Castro (2022): model of financial crises and policy counterfactuals based on particle filter

Model

Key ingredients:

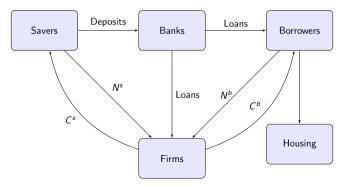
- Household default
- Frictional intermediation between borrowers, firms, and savers
- Bank runs
- Nominal rigidities



Model

Key ingredients:

- Household default
- Frictional intermediation between borrowers, firms, and savers
- Bank runs
- Nominal rigidities



Key Model Ingredient I: Borrowers



- Borrow in long-term debt B_t^b , purchase houses h_t
- Family construct w/ housing quality and moving shocks. In equilibrium:

household default
$$_t = f\left(rac{B_{t-1}^b/\Pi_t}{p_t^h h_{t-1}}
ight)$$

New borrowing subject to LTV constraint

$$B_t^{b,\text{new}} \le \theta^{LTV} p_t^h h_t^{\text{new}}$$

Key Model Ingredient I: Borrowers



- Borrow in long-term debt B_t^b , purchase houses h_t
- Family construct w/ housing quality and moving shocks. In equilibrium:

household default_t =
$$f\left(\frac{B_{t-1}^b/\Pi_t}{p_t^h h_{t-1}}\right)$$

New borrowing subject to LTV constraint

$$B_t^{b, ext{new}} \leq heta^{LTV} p_t^h h_t^{ ext{new}}$$

Key Model Ingredient I: Borrowers



- Borrow in long-term debt B_t^b , purchase houses h_t
- Family construct w/ housing quality and moving shocks. In equilibrium:

household default_t =
$$f\left(\frac{B_{t-1}^b/\Pi_t}{p_t^h h_{t-1}}\right)$$

New borrowing subject to LTV constraint

$$B_t^{b,\text{new}} \leq \theta^{LTV} p_t^h h_t^{\text{new}}$$

Key Model Ingredient II: Frictional Banks



Banks maximize PDV of dividends subject to capital requirement

$$\underbrace{\kappa_t}_{\text{capital requirement}} (\underbrace{Q_t^b B_t^b}_{\text{capital requirement}} + \underbrace{Q_t^f B_t^f}_{\text{bank capital}}) \leq \underbrace{\Phi_t E_t}_{\text{bank capital}}$$

Banks default if equity becomes negative,

$$E_t < 0 \Leftrightarrow R_t^b B_{t-1}^b - D_{t-1} < 0$$

• Liquidation Friction: assets of failed banks sold at markdown λ^d , paid to depositors

Key Model Ingredient II: Frictional Banks



• Banks maximize PDV of dividends subject to capital requirement

$$\kappa_t \qquad \qquad (\overbrace{Q_t^b B_t^b}^b + \overbrace{Q_t^f B_t^f}^f) \leq \underbrace{\Phi_t E_t}_{\text{bank capital}}$$

Banks default if equity becomes negative,

$$E_t < 0 \Leftrightarrow R_t^b B_{t-1}^b - D_{t-1} < 0$$

• Liquidation Friction: assets of failed banks sold at markdown λ^d , paid to depositors

Key Model Ingredient II: Frictional Banks



Banks maximize PDV of dividends subject to capital requirement

$$\kappa_t \qquad (\overbrace{Q_t^b B_t^b}^{\text{hh lending}} + \overbrace{Q_t^f B_t^f}^{\text{firm lending}}) \leq \underbrace{\Phi_t E_t}_{\text{bank capital}}$$

Banks default if equity becomes negative,

$$E_t < 0 \Leftrightarrow R_t^b B_{t-1}^b - D_{t-1} < 0$$

• Liquidation Friction: assets of failed banks sold at markdown λ^d , paid to depositors

Key Model Ingredient III: Bank Runs



Runs: possible if bank solvent, but illiquid

$$R_t^b B_{t-1}^b - D_{t-1} \ge 0$$
 (solvent) $(1 - \lambda^d) R_t^b B_{t-1}^b - D_{t-1} < 0$ (illiquid)

- Runs self-fulfilling in this region
- Multiplicity solved as in Diamond & Dybvig (1983): sunspot, $\omega_t=1$ w.p. p
- Crisis and insolvency regions depend on state variables (B_{t-1}, D_t)

liquidity threshold :
$$u_t^R \equiv \frac{D_{t-1}}{(1-\lambda^d)R_t^bB_{t-1}^b}$$

solvency threshold : $u_t^I \equiv \frac{D_{t-1}}{R_t^bB_{t-1}^b}$

Run impossible if $u_t^R < 1$. Run possible if $u_t^I < 1 < u_t^R$. Run certain if $u_t^I > 1$.

Key Model Ingredient III: Bank Runs



• Runs: possible if bank solvent, but illiquid

$$R_t^b B_{t-1}^b - D_{t-1} \ge 0$$
 (solvent) $(1 - \lambda^d) R_t^b B_{t-1}^b - D_{t-1} < 0$ (illiquid)

- Runs self-fulfilling in this region
- ullet Multiplicity solved as in Diamond & Dybvig (1983): sunspot, $\omega_t=1$ w.p. p
- Crisis and insolvency regions depend on state variables (B_{t-1}, D_t)

liquidity threshold :
$$u_t^R \equiv \frac{D_{t-1}}{(1-\lambda^d)R_t^bB_{t-1}^b}$$
 solvency threshold : $u_t^I \equiv \frac{D_{t-1}}{R_t^bB_{t-1}^b}$

Run impossible if $u_t^R < 1$. Run possible if $u_t^I < 1 < u_t^R$. Run certain if $u_t^I > 1$.

Key Model Ingredient III: Bank Runs



Runs: possible if bank solvent, but illiquid

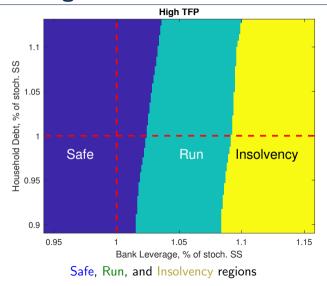
$$R_t^b B_{t-1}^b - D_{t-1} \ge 0$$
 (solvent) $(1 - \lambda^d) R_t^b B_{t-1}^b - D_{t-1} < 0$ (illiquid)

- Runs self-fulfilling in this region
- Multiplicity solved as in Diamond & Dybvig (1983): sunspot, $\omega_t=1$ w.p. p
- Crisis and insolvency regions depend on state variables (B_{t-1}, D_t)

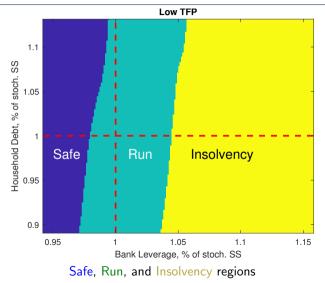
liquidity threshold
$$: u_t^R \equiv \frac{D_{t-1}}{(1-\lambda^d)R_t^bB_{t-1}^b}$$
 solvency threshold
$$: u_t^I \equiv \frac{D_{t-1}}{R_t^bB_{t-1}^b}$$

Run impossible if $u_t^R < 1$. Run possible if $u_t^I < 1 < u_t^R$. Run certain if $u_t^I > 1$.

Run Regions: High TFP



Run Regions: Low TFP









- Aggregate shocks:
 - 1. TFP A_t
 - 2. Sunspot shock ω_t
 - 3. Funding preference shock μ_t
- If bank leverage is high (relative to other states), sunspot may trigger a run
 - Bank capital collapses: lending ↓, spreads ↑
 - Lending ↓, spreads ↑ ⇒ disposable income ↓ ⇒consumption ↓
 - 3. Borrower constraint starts binding, MPC 1
 - 4. consumption $\downarrow \Rightarrow$ house prices \downarrow (through SDF) \Rightarrow defaults \uparrow
 - 5. Persistent defaults further hamper bank capita
- Nominal rigidities: borrower consumption ↓ ⇒ GDP ↓
 - Working capital constraint: bank capital $\downarrow \Rightarrow$ marginal costs \uparrow

Banking Crisis \Rightarrow Demand-driven recession (Mian & Sufi 2014)







- Aggregate shocks:
 - 1. TFP A_t
 - 2. Sunspot shock ω_t
 - 3. Funding preference shock μ_t
- If bank leverage is high (relative to other states), sunspot may trigger a run
 - 1. Bank capital collapses: lending ↓, spreads ↑
 - Lending ↓, spreads ↑ ⇒ disposable income ↓ ⇒consumption ↓
 - 3. Borrower constraint starts binding, MPC ↑
 - 4. consumption $\downarrow \Rightarrow$ house prices \downarrow (through SDF) \Rightarrow defaults \uparrow
 - 5. Persistent defaults further hamper bank capita
- Nominal rigidities: borrower consumption ↓ ⇒ GDP ↓
 - Working capital constraint: bank capital $\downarrow \Rightarrow$ marginal costs \uparrow

Banking Crisis \Rightarrow Demand-driven recession (Mian & Sufi 2014)







- Aggregate shocks:
 - 1. TFP A_t
 - 2. Sunspot shock ω_t
 - 3. Funding preference shock μ_t
- If bank leverage is high (relative to other states), sunspot may trigger a run
 - 1. Bank capital collapses: lending ↓, spreads ↑
 - 2. Lending \downarrow , spreads $\uparrow \Rightarrow$ disposable income $\downarrow \Rightarrow$ consumption \downarrow
 - 3. Borrower constraint starts binding, MPC 1
 - 4. consumption $\downarrow \Rightarrow$ house prices \downarrow (through SDF) \Rightarrow defaults \uparrow
 - 5. Persistent defaults further hamper bank capita
- Nominal rigidities: borrower consumption ↓ ⇒ GDP ↓
 - Working capital constraint: bank capital $\downarrow \Rightarrow$ marginal costs \uparrow

Banking Crisis ⇒ Demand-driven recession (Mian & Sufi 2014)







- Aggregate shocks:
 - 1. TFP A_t
 - 2. Sunspot shock ω_t
 - 3. Funding preference shock μ_t
- If bank leverage is high (relative to other states), sunspot may trigger a run
 - 1. Bank capital collapses: lending ↓, spreads ↑
 - 2. Lending \downarrow , spreads $\uparrow \Rightarrow$ disposable income $\downarrow \Rightarrow$ consumption \downarrow
 - 3. Borrower constraint starts binding, MPC 1
 - 4. consumption $\downarrow \Rightarrow$ house prices \downarrow (through SDF) \Rightarrow defaults \uparrow
 - 5. Persistent defaults further hamper bank capita
- Nominal rigidities: borrower consumption ↓ ⇒ GDP ↓
 - Working capital constraint: bank capital $\downarrow \Rightarrow$ marginal costs \uparrow

Banking Crisis ⇒ Demand-driven recession (Mian & Sufi 2014)







- Aggregate shocks:
 - 1. TFP A_t
 - 2. Sunspot shock ω_t
 - 3. Funding preference shock μ_t
- If bank leverage is high (relative to other states), sunspot may trigger a run
 - 1. Bank capital collapses: lending ↓, spreads ↑
 - 2. Lending \downarrow , spreads $\uparrow \Rightarrow$ disposable income $\downarrow \Rightarrow$ consumption \downarrow
 - 3. Borrower constraint starts binding, MPC ↑
 - 4. consumption $\downarrow \Rightarrow$ house prices \downarrow (through SDF) \Rightarrow defaults \uparrow
 - 5. Persistent defaults further hamper bank capital
- Nominal rigidities: borrower consumption ↓ ⇒ GDP ↓
 - Working capital constraint: bank capital ↓ ⇒ marginal costs ↑

Banking Crisis \Rightarrow Demand-driven recession (Mian & Sufi 2014)







- Aggregate shocks:
 - 1. TFP A_t
 - 2. Sunspot shock ω_t
 - 3. Funding preference shock μ_t
- If bank leverage is high (relative to other states), sunspot may trigger a run
 - 1. Bank capital collapses: lending ↓, spreads ↑
 - 2. Lending \downarrow , spreads $\uparrow \Rightarrow$ disposable income $\downarrow \Rightarrow$ consumption \downarrow
 - 3. Borrower constraint starts binding, MPC ↑
 - 4. consumption $\downarrow \Rightarrow$ house prices \downarrow (through SDF) \Rightarrow defaults \uparrow
 - 5. Persistent defaults further hamper bank capita
- Nominal rigidities: borrower consumption ↓ ⇒ GDP ↓
 - Working capital constraint: bank capital ↓ ⇒ marginal costs ↑

Banking Crisis \Rightarrow Demand-driven recession (Mian & Suti 2014)







- Aggregate shocks:
 - 1. TFP A_t
 - 2. Sunspot shock ω_t
 - 3. Funding preference shock μ_t
- If bank leverage is high (relative to other states), sunspot may trigger a run
 - 1. Bank capital collapses: lending ↓, spreads ↑
 - 2. Lending \downarrow , spreads $\uparrow \Rightarrow$ disposable income $\downarrow \Rightarrow$ consumption \downarrow
 - 3. Borrower constraint starts binding, MPC ↑
 - 4. consumption $\downarrow \Rightarrow$ house prices \downarrow (through SDF) \Rightarrow defaults \uparrow
 - 5. Persistent defaults further hamper bank capital
- Nominal rigidities: borrower consumption ↓ ⇒ GDP ↓
 - Working capital constraint: bank capital ↓ ⇒ marginal costs ↑

Banking Crisis \Rightarrow Demand-driven recession (Mian & Sufi 2014)



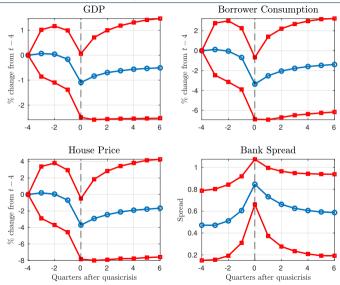




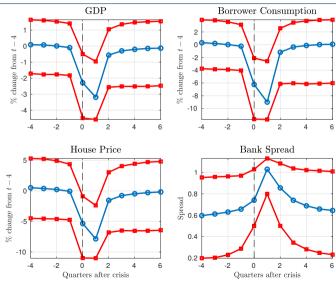
- Aggregate shocks:
 - 1. TFP A_t
 - 2. Sunspot shock ω_t
 - 3. Funding preference shock μ_t
- If bank leverage is high (relative to other states), sunspot may trigger a run
 - 1. Bank capital collapses: lending ↓, spreads ↑
 - 2. Lending \downarrow , spreads $\uparrow \Rightarrow$ disposable income $\downarrow \Rightarrow$ consumption \downarrow
 - 3. Borrower constraint starts binding, MPC ↑
 - 4. consumption ↓ ⇒ house prices ↓ (through SDF) ⇒ defaults ↑
 - 5. Persistent defaults further hamper bank capital
- Nominal rigidities: borrower consumption ↓ ⇒ GDP ↓
 - Working capital constraint: bank capital $\downarrow \Rightarrow$ marginal costs \uparrow

Banking Crisis ⇒ Demand-driven recession (Mian & Sufi 2014)

Entering the Crisis Region



Typical Financial Crisis



- Benchmark capital requirement $ar{\kappa}=$ 8.5% (MCR + CCB)
- BIS CCyB implementation range: [0, 2.5%
- Idea: κ_t responds to $u_t^R \simeq$ proxy for bank leverage
- Baseline policy:

$$\kappa_t = \begin{cases} \overline{\kappa} \times \max\{1, u_t^R\}^{\phi_\kappa}, & \text{for } \text{run}_t = 0\\ \overline{\kappa}, & \text{for } \text{run}_t = 1 \end{cases}$$

• "CCyB Release" policy

$$\kappa_t = \begin{cases} \bar{\kappa} \times \max\{1, u_t^R\}^{\phi_\kappa}, & \text{for run}_t = \\ \bar{\kappa} - 2.5\%, & \text{for run}_t = \end{cases}$$

- Benchmark capital requirement $\bar{\kappa}=8.5\%$ (MCR + CCB)
- BIS CCyB implementation range: [0, 2.5%]
- Idea: κ_t responds to $u_t^R \simeq$ proxy for bank leverage
- Baseline policy:

$$\kappa_t = \begin{cases} \overline{\kappa} \times \max\{1, u_t^R\}^{\phi_\kappa}, & \text{for } \text{run}_t = 0 \\ \overline{\kappa}, & \text{for } \text{run}_t = 1 \end{cases}$$

"CCyB Release" policy:

$$\kappa_t = egin{cases} ar{\kappa} imes \max\{1, u_t^R\}^{\phi_\kappa}, & ext{for run}_t = 0 \\ ar{\kappa} - 2.5\%, & ext{for run}_t = 0 \end{cases}$$

- Benchmark capital requirement $\bar{\kappa}=8.5\%$ (MCR + CCB)
- BIS CCyB implementation range: [0, 2.5%]
- Idea: κ_t responds to $u_t^R \simeq$ proxy for bank leverage
- Baseline policy:

$$\kappa_t = \begin{cases} \bar{\kappa} \times \max\{1, u_t^R\}^{\phi_\kappa}, & \text{for } \operatorname{run}_t = 0\\ \bar{\kappa}, & \text{for } \operatorname{run}_t = 1 \end{cases}$$

"CCyB Release" policy:

$$\kappa_t = \begin{cases} \bar{\kappa} \times \max\{1, u_t^R\}^{\phi_\kappa}, & \text{for run}_t = 0\\ \bar{\kappa} - 2.5\%, & \text{for run}_t = 0 \end{cases}$$

- Benchmark capital requirement $\bar{\kappa} = 8.5\%$ (MCR + CCB)
- BIS CCyB implementation range: [0, 2.5%]
- Idea: κ_t responds to $u_t^R \simeq$ proxy for bank leverage
- Baseline policy:

$$\kappa_t = \begin{cases} \bar{\kappa} \times \max\{1, u_t^R\}^{\phi_\kappa}, & \text{for } \operatorname{run}_t = 0\\ \bar{\kappa}, & \text{for } \operatorname{run}_t = 1 \end{cases}$$

• "CCyB Release" policy:

$$\kappa_t = \begin{cases} \bar{\kappa} \times \max\{1, u_t^R\}^{\phi_\kappa}, & \text{for run}_t = 0\\ \bar{\kappa} - 2.5\%, & \text{for run}_t = 1 \end{cases}$$

Effects of Policies

Variable	(i) No Policy	(ii) CCyB Policy	(iii) CCyB Release
Bank Leverage	10.06	8.68	8.67
Pr. of Crisis	5.07	1.29	1.22
Median $\%$ Δ GDP in Crisis	-3.02	-3.34	-2.99
CEV Saver		+2.73%	+2.76%
CEV Borrower		-3.14%	-3.18%

- CCyB amplifies precautionary motives for banks
- Lower bank leverage ⇒ lower run probability
- $\bullet \quad \mathsf{CCyB} \ \mathsf{deepens} \ \mathsf{crisis} \ \mathsf{severity} \Rightarrow \mathsf{time\text{-}consistency} \ \mathsf{problem}$
- Savers like CCyB; borrowers dislike it

Could CCyB have helped in 2008?

- 1. Estimate structural shocks $\{A_t, \mu_t, \omega_t\}_{t=0}^T$
 - Make model match observables given $\kappa_t = \bar{\kappa}$ (Basel II)
 - Sample: 2000Q1 2015Q4
 - Observables $\{\mathcal{Y}_t\}_{t=0}^T \equiv \{C_t, \mathsf{TED} \; \mathsf{spread}_t\}_{t=0}^T$ Macro Data
 - Use adapted particle filter (Fernández-Villaverde and Rubio-Ramírez, 2007) to estimate

$$\{\hat{p}(A_t, \mu_t, \omega_t | \mathcal{Y}_t)\}_{t=0}^T$$

▶ Particle Filter details

- 2. Use resulting estimates $\{\hat{A}_t, \hat{\mu}_t, \hat{\omega}_t\}_{t=0}^T$ to study counterfactuals:
 - CCyB
 - CCyB release

Could CCyB have helped in 2008?

- 1. Estimate structural shocks $\{A_t, \mu_t, \omega_t\}_{t=0}^T$
 - Make model match observables given $\kappa_t = \bar{\kappa}$ (Basel II)
 - Sample: 2000Q1 2015Q4
 - Observables $\{\mathcal{Y}_t\}_{t=0}^T \equiv \{C_t, \mathsf{TED} \; \mathsf{spread}_t\}_{t=0}^T$ $\qquad \mathsf{Macro Data}$
 - Use adapted particle filter (Fernández-Villaverde and Rubio-Ramírez, 2007) to estimate

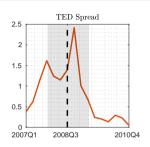
$$\{\hat{p}(A_t, \mu_t, \omega_t | \mathcal{Y}_t)\}_{t=0}^T$$

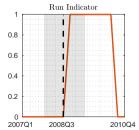
Particle Filter details

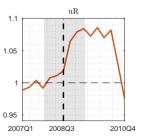
- 2. Use resulting estimates $\{\hat{A}_t, \hat{\mu}_t, \hat{\omega}_t\}_{t=0}^T$ to study counterfactuals:
 - CCyB
 - CCyB release

Crisis of 2007-2008, No Policy

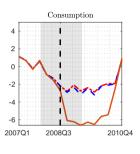


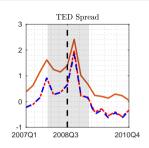


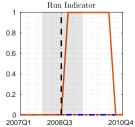


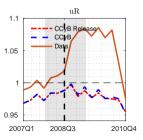


Crisis of 2007-2008, CCyB Counterfactual









- CCyB could have prevented bank run in 2007-08
 - ...but not a (smaller) recession
 - Recession mostly driven by TFP shocks
 - CCyB could have helped with "soft landing"
 - u_t^R remains below $1 \Rightarrow$ no need to activate CCyB along equilibrium path
- Quantifying Results: define the consumption gap

$$\mathcal{G} = \sum_{t=2007Q1}^{T=2010Q4} \frac{C_t^{\text{CCyB}} - C_t^{\text{data}}}{C_{2007Q1}^{\text{data}}}$$

G	$\mathcal{G} imes \mathcal{C}_{2007Q1}^{data}$

- CCyB could have prevented bank run in 2007-08
 - ...but not a (smaller) recession
 - Recession mostly driven by TFP shocks
 - CCyB could have helped with "soft landing"
 - u_t^R remains below $1 \Rightarrow$ no need to activate CCyB along equilibrium path
- Quantifying Results: define the consumption gap

$$\mathcal{G} = \sum_{t=2007Q1}^{T=2010Q4} \frac{C_t^{\text{CCyB}} - C_t^{\text{data}}}{C_{2007Q1}^{\text{data}}}$$

G	$\mathcal{G} imes \mathcal{C}^{ ext{data}}_{2007Q1}$

- CCyB could have prevented bank run in 2007-08
 - ...but not a (smaller) recession
 - Recession mostly driven by TFP shocks
 - CCyB could have helped with "soft landing"
 - u_t^R remains below $1 \Rightarrow$ no need to activate CCyB along equilibrium path
- Quantifying Results: define the consumption gap

$$\mathcal{G} = \sum_{t=2007Q1}^{T=2010Q4} rac{C_t^{\mathsf{CCyB}} - C_t^{\mathsf{data}}}{C_{2007Q1}^{\mathsf{data}}}$$

G	$\mathcal{G} imes \mathcal{C}^{data}_{2007Q1}$

- CCyB could have prevented bank run in 2007-08
 - ...but not a (smaller) recession
 - Recession mostly driven by TFP shocks
 - CCyB could have helped with "soft landing"
 - u_t^R remains below $1 \Rightarrow$ no need to activate CCyB along equilibrium path
- Quantifying Results: define the consumption gap

$$\mathcal{G} = \sum_{t=2007Q1}^{T=2010Q4} \frac{C_t^{\text{CCyB}} - C_t^{\text{data}}}{C_{2007Q1}^{\text{data}}}$$

	\mathcal{G}	$\mathcal{G} imes \mathcal{C}^{ ext{data}}_{2007Q1}$
Raise CCyB	25.7%	\$ 2,710.5 bn
Raise+Lower CCyB	26.9%	\$ 2,851.8 bn

Conclusion

This Paper

- Quantitative analysis of CCyB in the 2008-09 financial crisis
- Structural Model + Data

CCyB

- Ex-ante benefits, ex-post costs: likely not time-consistent
- CCyB release policy could help with time-consistency issues
- Could have mitigated financial panic in 2007-08
- CCyB effective even if not activated
- "Stark rule": results robust to other types of rules

Conclusion

This Paper

- Quantitative analysis of CCyB in the 2008-09 financial crisis
- Structural Model + Data

CCyB

- Ex-ante benefits, ex-post costs: likely not time-consistent
- CCyB release policy could help with time-consistency issues
- Could have mitigated financial panic in 2007-08
- CCyB effective even if not activated
- "Stark rule": results robust to other types of rules



- Face value B_{t-1}^b ,
- Fraction γ matures every period
- Family construct
- 1. Borrower family enters period with states

$$h_{t-1}, B_{t-1}^b$$

2. Continuum of members $i \in [0, 1]$, each with

$$h_{t-1}, B_{t-1}^b, \nu_t(i), \zeta_t(i)$$

where

$$u_t(i) \sim F^b \in [0, \infty)$$
 is a house quality shock $\zeta_t(i) = 1 \text{ w.p. m is a moving shock}$



- Face value B_{t-1}^b ,
- Fraction γ matures every period
- Family construct
- 1. Borrower family enters period with states

$$h_{t-1}, B_{t-1}^b$$

2. Continuum of members $i \in [0, 1]$, each with

$$h_{t-1}, B_{t-1}^b, \nu_t(i), \zeta_t(i)$$

where

$$u_t(i) \sim F^b \in [0, \infty)$$
 is a house quality shock $\zeta_t(i) = 1 \text{ w.p. m is a moving shock}$



- Face value B_{t-1}^b ,
- Fraction γ matures every period
- Family construct
- 1. Borrower family enters period with states

$$h_{t-1}, B_{t-1}^b$$

2. Continuum of members $i \in [0, 1]$, each with

$$h_{t-1}, B_{t-1}^b, \nu_t(i), \zeta_t(i)$$

where

$$u_t(i) \sim F^b \in [0, \infty)$$
 is a house quality shock $\zeta_t(i) = 1$ w.p. m is a moving shock



- If $\zeta_t(i)=0$, w.p. $1-\mathrm{m}$, keeps house, pays coupon γB_{t-1}^b
- If $\zeta_t(i) = 1$, w.p. m, has to move. Can either:
 - 1. Prepay remaining balance B_{t-1}^b , and sell house worth $\nu_t(i)p_th_{t-1}$

0

2. Default on maturing debt, lose collatera



- If $\zeta_t(i)=0$, w.p. $1-\mathrm{m}$, keeps house, pays coupon γB_{t-1}^b
- If $\zeta_t(i) = 1$, w.p. m, has to move. Can either:
 - 1. Prepay remaining balance B_{t-1}^b , and sell house worth $\nu_t(i)p_th_{t-1}$

0

Default on maturing debt, lose collatera



- If $\zeta_t(i)=0$, w.p. $1-\mathrm{m}$, keeps house, pays coupon γB_{t-1}^b
- If $\zeta_t(i) = 1$, w.p. m, has to move. Can either:
 - 1. Prepay remaining balance B_{t-1}^b , and sell house worth $\nu_t(i)p_th_{t-1}$

0

Default on maturing debt, lose collatera



- If $\zeta_t(i)=0$, w.p. $1-\mathrm{m}$, keeps house, pays coupon γB_{t-1}^b
- If $\zeta_t(i) = 1$, w.p. m, has to move. Can either:
 - 1. Prepay remaining balance B_{t-1}^b , and sell house worth $\nu_t(i)p_th_{t-1}$

<u>or</u>

2. Default on maturing debt, lose collatera



- If $\zeta_t(i)=0$, w.p. $1-\mathrm{m}$, keeps house, pays coupon γB_{t-1}^b
- If $\zeta_t(i) = 1$, w.p. m, has to move. Can either:
 - 1. Prepay remaining balance B_{t-1}^b , and sell house worth $\nu_t(i)p_th_{t-1}$

<u>or</u>

2. Default on maturing debt, lose collateral

Borrower Family Problem



$$V_t^b(B_{t-1}^b, h_{t-1}) = \max_{c_t^b, h_t^b, h_t^{\text{new}}, \mu(\nu)} \left\{ u(c_t, n_t) + \xi^b \log(h_t) + \beta \mathbb{E}_t V_{t+1}^b(B_t^b, h_t) \right\}$$

subject to budget constraint

$$c_{t}^{b} + \underbrace{\frac{B_{t-1}^{b}}{\Pi_{t}} \left\{ (1-\mathrm{m})\gamma + \mathrm{m} \int [1-\iota(\nu)] \mathrm{d}F^{b}(\nu) \right\}}_{\text{debt repayment}} + \underbrace{p_{t}h_{t}^{\mathrm{new}}}_{\text{house purchase}} \leq (1-\tau)w_{t}n_{t}^{b} + \underbrace{Q_{t}^{b}B_{t}^{b,\mathrm{new}}}_{\text{new debt}} + \underbrace{\mathrm{m}p_{t}h_{t-1}}_{\text{t}} \int \nu[1-\gamma\iota(\nu)] \mathrm{d}F^{b}(\nu)$$

and borrowing constraint

$$B_t^{b,\text{new}} \leq \theta^{LTV} p_t h_t^{\text{new}}$$

Borrower Family Problem



$$V_t^b(B_{t-1}^b, h_{t-1}) = \max_{c_t^b, n_t^b, h_t^{\text{new}}, B_t^b, \text{new}, \iota(\nu)} \left\{ u(c_t, n_t) + \xi^b \log(h_t) + \beta \mathbb{E}_t V_{t+1}^b(B_t^b, h_t) \right\}$$

subject to budget constraint

$$c_{t}^{b} + \underbrace{\frac{B_{t-1}^{b}}{\Pi_{t}} \left\{ (1-\mathrm{m})\gamma + \mathrm{m} \int [1-\iota(\nu)] \mathrm{d}F^{b}(\nu) \right\}}_{\text{debt repayment}} + \underbrace{p_{t}h_{t}^{\mathrm{new}}}_{\text{house purchase}} \leq (1-\tau)w_{t}n_{t}^{b} + \underbrace{Q_{t}^{b}B_{t}^{b,\mathrm{new}}}_{\text{new debt}} + \underbrace{\mathrm{m}p_{t}h_{t-1} \int \nu[1-\gamma\iota(\nu)] \mathrm{d}F^{b}(\nu)}_{\text{sale of non-forcel, houses}} \leq \frac{1-\tau}{2}$$

and borrowing constraint

$$B_t^{b,\text{new}} \leq \theta^{LTV} p_t h_t^{\text{new}}$$

Borrower Family Problem



$$V_t^b(B_{t-1}^b, h_{t-1}) = \max_{c_t^b, h_t^b, h_t^{\text{new}}, \mu(\nu)} \left\{ u(c_t, n_t) + \xi^b \log(h_t) + \beta \mathbb{E}_t V_{t+1}^b(B_t^b, h_t) \right\}$$

subject to budget constraint

$$c_t^b + \underbrace{\frac{B_{t-1}^b}{\Pi_t} \left\{ (1-\mathrm{m})\gamma + \mathrm{m} \int [1-\iota(\nu)] \mathrm{d}F^b(\nu) \right\}}_{\text{debt repayment}} + \underbrace{\frac{p_t h_t^{\mathsf{new}}}{h_{\mathsf{ouse purchase}}}} \leq (1-\tau)w_t n_t^b + \underbrace{Q_t^b B_t^{b,\mathsf{new}}}_{\mathsf{new debt}} + \underbrace{\mathrm{m}p_t h_{t-1} \int \nu [1-\gamma\iota(\nu)] \mathrm{d}F^b(\nu)}_{\mathsf{sale of non-forcel, houses}} \leq \frac{1-\tau}{2}$$

and borrowing constraint

$$B_t^{b,\text{new}} \leq \theta^{LTV} p_t h_t^{\text{new}}$$

Borrower Default



• Default iff $\nu \leq \nu_t^*$,

$$u_t^* = rac{B_{t-1}^b}{\Pi_t p_t h_{t-1}} \simeq exttt{Loan-to-Value}$$

- Default rate = $F^b(\nu_t^*)$
- Lender payoff per unit of debt

$$R_t^b = \underbrace{(1-\mathbf{m})[(1-\gamma)Q_t^b + \gamma]}_{\text{non-movers}} + \mathbf{m} \left\{ \underbrace{1-F^b(\nu_t^*)}_{\text{repaid}} + \underbrace{\underbrace{(1-\lambda^b)}_{0} \int_{0}^{\nu_t^*} \nu \frac{p_t h_{t-1}}{B_{t-1}^b/\Pi_t} \mathrm{d}F^b}_{\text{foreclosed}} \right\}$$

Borrower Default



• Default iff $\nu \leq \nu_t^*$,

$$u_t^* = rac{B_{t-1}^b}{\Pi_t p_t h_{t-1}} \simeq exttt{Loan-to-Value}$$

- Default rate $= F^b(\nu_t^*)$
- Lender payoff per unit of deb

$$R_t^b = \underbrace{(1-\mathbf{m})[(1-\gamma)Q_t^b + \gamma]}_{\text{non-movers}} + \mathbf{m} \left\{ \underbrace{1-F^b(\nu_t^*)}_{\text{repaid}} + \underbrace{\underbrace{(1-\lambda^b)}_{0} \int_{0}^{\nu_t^*} \nu \frac{p_t h_{t-1}}{B_{t-1}^b/\Pi_t} \mathrm{d}F^b}_{\text{foreclosed}} \right\}$$

Borrower Default



• Default iff $\nu \leq \nu_t^*$,

$$u_t^* = rac{B_{t-1}^b}{\Pi_t p_t h_{t-1}} \simeq exttt{Loan-to-Value}$$

- Default rate = $F^b(\nu_t^*)$
- Lender payoff per unit of debt

$$R_t^b = \underbrace{(1-\mathrm{m})[(1-\gamma)Q_t^b + \gamma]}_{\text{non-movers}} + \mathrm{m} \left\{ \underbrace{1-F^b(\nu_t^*)}_{\text{repaid}} + \underbrace{\underbrace{(1-\lambda^b)}_{0} \int_{0}^{\nu_t^*} \nu \frac{p_t h_{t-1}}{B_{t-1}^b/\Pi_t} \mathrm{d}F^b}_{\text{foreclosed}} \right\}$$

Banks



- Continuum of banks indexed by i
- Choose household lending b^b , firm lending b^f , deposits d, dividends θ
- State variable: capital e
- Run taken as given

$$\underbrace{V_{it}(e_{it})}_{\text{mkt value}} = \max_{b_{it+1}^b, b_{it+1}^f, d_{it+1}, \theta_{it}} \underbrace{\left(1 - \theta_{it}\right) e_{it}}_{\text{dividend}} - \underbrace{\frac{\varphi}{2} e_{it} (\theta_{it} - \bar{\theta})^2}_{\text{div adj costs}} + \underbrace{\mathbb{E}_t \left\{ \Lambda_{t,t+1}^s \max\{0, V_{it+1}(e_{it+1})\} \right\}}_{\text{ex-dividend value}}$$

s.t.

budget constraint:
$$Q_t^b b_{it+1}^b + Q_t^f b_{it+1}^f = \theta_{it} e_{it} + Q_t^d d_{it+1} + b_{it+1}^f$$

capital req.:
$$V_{it}(e_{it}) \geq \kappa_t(Q^b_t b^b_{it+1} + Q^f_t b^f_{it+1})$$

LoM equity:
$$e_{it+1} = \frac{(1 - \operatorname{run}_{t+1})}{\prod_{t+1}} [R_{t+1}^b b_{it+1}^b - d_{it+1}]$$

Bank problem linear in $e_{it} \Rightarrow \mathbf{aggregation}$

First-order condition with respect to lending:

$$\mathbb{E}_t \left[\frac{\Lambda_{t+1}}{\Pi_{t+1}} \underbrace{(1 - \mathsf{x}_{t+1})}_{\text{future runs}} \underbrace{\Phi_{t+1}}_{\text{future constraints}} \left(\frac{\overbrace{R^b_{t+1}}^{b}}{Q^b_{t}} - \frac{1}{Q^d_{t}} \right) \right] = \underbrace{\kappa_t \mu_t}_{\text{current constraints}}$$

where Φ_t is such that $V_t(e_t) = \Phi_t e_t$ and

$$\Phi_{t} = \frac{\left\{1 + \bar{\theta} \left[(Q_{t}^{d})^{-1} \mathbb{E}_{t} \Omega_{t+1} - 1 \right] + \frac{1}{2\varphi} \left[(Q_{t}^{d})^{-1} \mathbb{E}_{t} \Omega_{t+1} - 1 \right]^{2} \right\}}{1 - \mu_{t}}$$

$$t+1 = \frac{\Lambda_{t,t+1}}{\Pi_{t+1}} (1 - x_{t+1}) \Phi_{t+1}$$

First-order condition with respect to lending:

$$\mathbb{E}_t \left[\frac{\Lambda_{t+1}}{\Pi_{t+1}} \underbrace{(1 - \mathsf{x}_{t+1})}_{\text{future runs}} \underbrace{\Phi_{t+1}}_{\text{future constraints}} \left(\frac{\overbrace{R^b_{t+1}}^{b}}{Q^b_{t}} - \frac{1}{Q^d_{t}} \right) \right] = \underbrace{\kappa_t \mu_t}_{\text{current constraints}}$$

where Φ_t is such that $V_t(e_t) = \Phi_t e_t$ and

$$\begin{split} \Phi_t &= \frac{\left\{1 + \bar{\theta} \left[(Q_t^d)^{-1} \mathbb{E}_t \Omega_{t+1} - 1 \right] + \frac{1}{2\varphi} \left[(Q_t^d)^{-1} \mathbb{E}_t \Omega_{t+1} - 1 \right]^2 \right\}}{1 - \mu_t} \\ \Omega_{t+1} &= \frac{\Lambda_{t,t+1}}{\Pi_{t+1}} (1 - x_{t+1}) \Phi_{t+1} \end{split}$$



Standard DSGE model w/ nominal rigidities

- Producers w/ Working Capital constraint → Phillips Curve
- Savers o Standard Euler Equation, Funding Shock μ_t savers
- Housing in fixed supply

$$h_t = 1$$

• Central Bank \rightarrow Taylor Rule

$$\frac{1}{Q_t} = \frac{1}{\bar{Q}} \left[\frac{\Pi_t}{\Pi} \right]^{\phi_{\pi}} \left[\frac{Y_t}{Y} \right]^{\phi_0}$$

Aggregate resource constraint;

$$C_t + \bar{G} + \mathsf{DWL} \; \mathsf{Default}_t = \underbrace{A_t N_t}_{\mathsf{e}} \underbrace{[1 - d(\Pi_t)]}_{\mathsf{Menu} \; \mathsf{Costs}}$$



Standard DSGE model w/ nominal rigidities

- Producers w/ Working Capital constraint → Phillips Curve
- Savers \rightarrow Standard Euler Equation, Funding Shock μ_t savers
- Housing in fixed supply

$$h_t = 1$$

Central Bank → Taylor Rule

$$\frac{1}{Q_t} = \frac{1}{\bar{Q}} \left[\frac{\Pi_t}{\Pi} \right]^{\phi_{\pi}} \left[\frac{Y_t}{Y} \right]^{\phi_0}$$

Aggregate resource constraint

$$C_t + \bar{G} + \mathsf{DWL} \; \mathsf{Default}_t = \underbrace{A_t N_t}_{=Y_t} \underbrace{[1 - d(\Pi_t)]}_{\mathsf{Menu} \; \mathsf{Costs}}$$



Standard DSGE model w/ nominal rigidities

- Producers w/ Working Capital constraint → Phillips Curve
- Savers \rightarrow Standard Euler Equation, Funding Shock μ_t savers
- Housing in fixed supply,

$$h_t = 1$$

Central Bank → Taylor Rule

$$\frac{1}{Q_t} = \frac{1}{\bar{Q}} \left[\frac{\Pi_t}{\Pi} \right]^{\phi_{\pi}} \left[\frac{Y_t}{Y} \right]^{\phi_0}$$

Aggregate resource constraint

$$C_t + \bar{G} + \mathsf{DWL} \; \mathsf{Default}_t = \underbrace{A_t N_t}_{=Y_t} \underbrace{[1 - d(\Pi_t)]}_{\mathsf{Menu} \; \mathsf{Costs}}$$



Standard DSGE model w/ nominal rigidities

- Producers w/ Working Capital constraint → Phillips Curve
- Savers \rightarrow Standard Euler Equation, Funding Shock μ_t savers
- Housing in fixed supply,

$$h_t = 1$$

• Central Bank \rightarrow Taylor Rule

$$rac{1}{Q_t} = rac{1}{ar{Q}} \left[rac{\Pi_t}{\Pi}
ight]^{\phi_\pi} \left[rac{Y_t}{Y}
ight]^{\phi_y}$$

Aggregate resource constraint

$$C_t + \bar{G} + \mathsf{DWL} \; \mathsf{Default}_t = \underbrace{A_t N_t}_{\mathsf{e} Y_t} \underbrace{[1 - d(\Pi_t)]}_{\mathsf{Menu} \; \mathsf{Costs}}$$



Standard DSGE model w/ nominal rigidities

- Producers w/ Working Capital constraint → Phillips Curve
- Savers \rightarrow Standard Euler Equation, Funding Shock μ_t savers
- Housing in fixed supply,

$$h_t = 1$$

• Central Bank \rightarrow Taylor Rule

$$rac{1}{Q_t} = rac{1}{ar{Q}} \left[rac{\Pi_t}{\Pi}
ight]^{\phi_\pi} \left[rac{Y_t}{Y}
ight]^{\phi_y}$$

Aggregate resource constraint,

$$C_t + \bar{G} + \mathsf{DWL} \ \mathsf{Default}_t = \underbrace{A_t N_t}_{=Y_t} \underbrace{[1 - d(\Pi_t)]}_{\mathsf{Menu Costs}}$$

Producers



• Hire labor and borrow to produce varieties $i \in [0, 1]$

$$Y_t = \left[\int_0^1 Y_t(i)^{\frac{\varepsilon}{\varepsilon - 1}} \mathrm{d}i \right]^{\frac{\varepsilon - 1}{\varepsilon}}$$

- Owned by savers with SDF $\Lambda_{t,t+1}^s$
- Subject to working capital constraint

$$Q_t^f B_t^f \ge \psi w_t N_t$$

Monopolistically competitive, Rotemberg menu costs

Menu
$$\mathsf{Costs}_t(i) = P_t Y_t \frac{\eta}{2} \left(\frac{P_t(i)}{P_{t-1}(i)\Pi} - 1 \right)^2$$

Firm FOC + Symmetric Price Setting = Standard Phillips Curve

$$\frac{\Pi_t}{\bar{\Pi}} \left(\frac{\Pi_t}{\bar{\Pi}} - 1 \right) = \mathbb{E}_t \left[\mathsf{\Lambda}^s_{t,t+1} \frac{\mathsf{Y}_{t+1}}{\mathsf{Y}_t} \frac{\Pi_{t+1}}{\bar{\Pi}} \left(\frac{\Pi_{t+1}}{\bar{\Pi}} - 1 \right) \right] + \frac{\varepsilon}{\eta} \left[\frac{\varepsilon - 1}{\varepsilon} - \frac{\mathsf{w}_t (1 + \psi (1 - Q_t^f))}{A_t} \right]$$

Savers



- Invest in bank deposits at rate Q_t^d or government debt at rate Q_t
- Own all banks and firms, receive total profits Γ_t

$$egin{aligned} V_t^s(D_{t-1},B_{t-1}^g) &= \max_{c_t^s,n_t^s,B_t^g,D_t} \left\{ u(c_t^s,n_t^s) + eta \mathbb{E}_t V_{t+1}^s
ight\} \ & ext{s.t.} \end{aligned}$$

$$c_{t}^{s} + Q_{t}B_{t}^{g} + \mu_{t}Q_{t}^{d}D_{t} \leq (1 - \tau)w_{t}n_{t}^{s} + \frac{R_{t}^{deposits}D_{t-1} + B_{t-1}^{g}}{\Pi_{t}} + \Gamma_{t} - T_{t}$$

• Γ_t = net transfers from corporate and financial sectors

▶ Back

Calibration







Moment	Target	Parameter		
Households				
Fraction Borrowers	Agg. MPC (Parker et al., 2013)	$\chi = 0.475$		
Avg. Maturity	5 years	$\gamma=1/20$		
Max LTV Ratio	85%	$\underline{m} = 0.1160$		
Debt/GDP	80%	$\xi=0.1038$		
Avg. Delinquency Rate	2%	$\sigma^b=$ 4.351		
	Banks			
Net Payout Ratio	3.5% (Baron, 2020)	theta = 0.9242		
Capital Requirement	8.5%, Basel III MCR+CCB	$\kappa=0.085$		
Avg. Lending Spread	2%	arpi = 0.005		
Avg. TED Spread	0.2%	$\lambda^d = 0.123$		
Prob. of Financial Crises	5.0%	p = 0.05		
Corporate debt/GDP	50%	$\psi=$ 0.6		

Two occasionally binding constraints + large crises ⇒ global solution ▶ Solution Method



Calibration - Standard NK Parameters



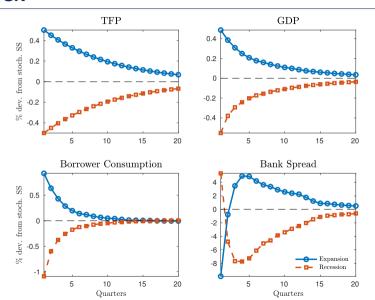
Parameter	Description	Value	Target/Reason
β	Discount Factor	0.995	2% Real Rate
σ	Risk Aversion/EIS	1	Standard
arphi	Frisch Elasticity	0.5	Standard
ε	CES	6	20% markup
η	Menu Cost	98.06	$\sim Calvo = 0.80$
П	Steady state Inflation	2% annual	U.S.
ϕ п	Taylor Rule Inflation	1.5	Standard
ϕ_Y	Taylor Rule GDP	0.5/4	Standard
λ^b	Loss given default	0.3	FDIC estimates

Model Solution Phace

- Two occasionally binding constraints ⇒ high-order approximation methods not useful
- Aggregate shocks ⇒ perfect foresight methods not useful
- Collocation + Time Iteration (Judd, Kubler, and Schmedders, 2002)
 - 1. Discretize grid of states $(B_{t-1}^b, D_{t-1}, A_t, \mu_t, \omega_t)$
 - 2. Guess approximants for policy fcns. to evaluate expectations
 - 3. Solve for current policy fcns. at each gridpoint
 - 4. Update approximants using solution for current policies
- "Iterates backwards in time" until policies converge
- Challenging due to lack of well-established convergence results
- Garcia and Zangwill (1981) method to handle inequalities

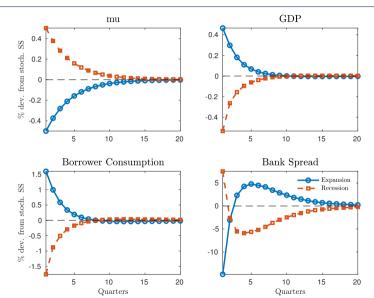
TFP Shock





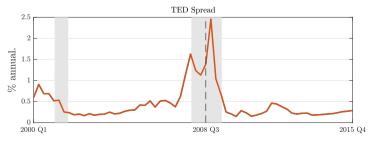
Funding Shock











Particle Filter Algorithm



Model in state space form (w./ additive Gaussian measurement error)

$$X_t = f(X_{t-1}, \epsilon_t)$$

 $Y_t = g(X_t) + \eta_t$
 $\eta_t \sim \mathcal{N}(0, \Sigma)$

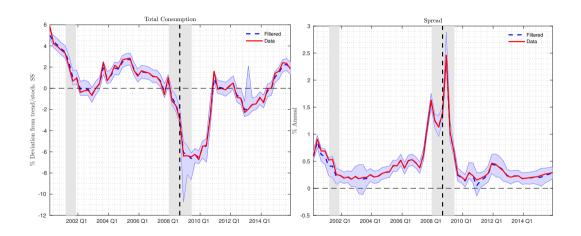
Particle filter output: $\{p(X_t|Y^t)\}_{t=0}^T$

- 1. Initialize $\{x_0^i\}_{i=1}^N$ by drawing uniformly from the model's ergodic distribution
- 2. Adapting: find $\bar{\epsilon}_t$ that maximizes the likelihood of observing y_t given $\bar{x}_{t-1} \equiv N^{-1} \sum_{i=1}^{N} x_{t-1}^i$
- 3. **Prediction**: for each particle i, draw $\epsilon_t^i \sim \mathcal{N}(\bar{\epsilon}_t, I)$ and compute $x_{t|t-1}^i = f(x_{t-1}^i, \epsilon_t^i)$
- 4. **Filtering**: for each $x_{t|t-1}^i$, compute weight

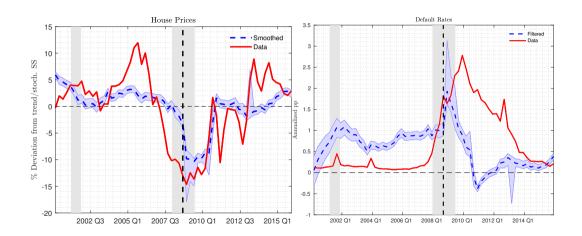
$$\pi_t^i = \frac{p(y_t|x_{t|t-1}^i; \gamma)p(x_t|x_{t|t-1}^i; \gamma)}{h(x_t|y^t, x_{t-1}^i)}$$

5. **Sampling**: use weights to draw N particles with replacement from $\{x_{t|t-1}^i\}_{i=1}^N$, call them $\{x_t^i\}_{i=1}^N$

Observables: Consumption and TED Spread



Other variables: House Prices, Default Rate



Estimated Shocks

