# Interacting prudential and monetary policies in an agent-based model

#### PKSG – 26<sup>th</sup> Annual Workshop

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# Holy trinity of Central Banking

From the One Bank Research Agenda by the BoE:

- Impacts on transmission mechanisms
- Co-ordination?
- Need for monetary policy reform?
- What is the appropriate macroprudential framework?



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#### Overview

- 1. Motivation
- 2. Challenges to macroeconomic modelling
- 3. Combining agent-based and stock-flow consistent modelling
- 4. Model characteristics and dynamics
- 5. Policy experiments
- 6. Conclusion & next steps

# Motivation: Monetary and (micro/macro) prudential policies

- Monetary: policies to target price stability
  - interest rate setting, open market operations, forward guidance, communication
- Prudential: "...policies that focus on the interactions between financial institutions, markets, infrastructure and the business cycle."
  - Micro-prudential: requirements in terms of capital, liquidity and leverage (BCBS 2010 / Seoul G20 2010),
  - Macro-prudential: curbing procyclical credit growth & contraction, limit the transmission of shocks across the financial system
- "... having two separate sets of instruments may not necessarily prevent situations in which they interact, and may therefore have compounding or conflicting effects on the objectives they pursue."

(Beau, Clerc & Mojon 2012)

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### Towards an AB-SFC paradigm

- A fully integrated and coherent representation of real and financial economies thanks to rigorous accounting rules of SFC models + local and disperse interaction and "emergence".
- AB-SFC models fundamentally aims at adding a new complexity layer besides the one referring to the role of agents' interactions in shaping individual and aggregate behaviours:

✓ in a monetary economy, agents are closely interrelated through a complex network linking their balance sheets

### Simple example



#### Interactions

- 1. Multi-layered contractual networks
- ... of property, debts and claims



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#### Interactions

- 1. Contractual networks
- 2. Markets

(...for cGoods, kGoods, labour, business loans, deposits, interbank loans)

- ⇒Different agents, different prices
- ⇒No market clearing assured



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Stochasticity: every run is different, due to

1. Interactions - e.g. probability for firms to change supplier:

$$\theta = \begin{cases} 1 - e^{\frac{\in p_{\chi} - p_{old}}{p_{\chi}}}, & \text{ if } p_{\chi} > p_{pf} \\ 0 & \text{ otherwise} \end{cases}$$

where  $\in$  = intensity of choice,  $p_{\chi}$  the lowest observed supplier price, and  $p_{pf}$  the preferred supplier's price

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Stochasticity: every run is different, due to

2. Decision rules - e.g. Wages and prices are backward-looking, with stochastic mark-up based on macroeconomic or microeconomic thresholds

$$\psi_{x,t}^{ulc} = \begin{cases} \psi_{x,t-1}^{ulc} (1+FN) \ if \ \frac{inv_{xt-1}}{inv_{x,t}^d} \le \upsilon^N \\ \psi_{x,t-1}^{ulc} (1-FN) \ if \ \frac{inv_{xt-1}}{inv_{x,t}^d} > \upsilon^N. \end{cases}$$

where  $inv_{xt-1}$  is current inventory,  $inv_{x,t}^d$  desired inventory, stochastic mark-up FN (Folded Normal Distribution)

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Sensing – what agents can see

✓ Their own variables + derived variables (e.g. net present value), plus:

- For the Central Bank: banks' capital ratio, liquidity ratio, inflation, total credit, GDP
- For banks: customer operating cash flows
- For households: inflation, & unemployment

#### Model

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Based on Caiani et al. (2016)

- Six types of agents with 100+ state variables
- 8,000 Households, 100 cFirms, 20 kFirms, 10 banks, 1 Central Bank , 1 Government
- interaction on 6 markets and in 10 contractual networks
- described in 88 behavioural equations with 50 parameters

### Flow diagram of Caiani et al. (2016)



Flow diagram of Caiani et al. (2016)



### Decision rules ( bounded rationality, simple heuristics, incomplete sensing)

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The Central bank decides on interest rates, liquidity ratio, capital ratio

Banks decide on capital, liquidity, bond buing

Households decide on consumption, wages, saving

Firms decide on investment, lending, hiring, bond buying

Government decides on taxes, bond selling PKSG - 26th Annual Workshop

#### Model characteristics

Key decision rules:

Inflation targeting (CB)

$$i_{cb,t}^{r} = \begin{cases} i_{cb,t-1}^{r} + \psi_{monetary} & \text{if } I_{t} > I_{t}^{*} \\ i_{cb,t-1}^{r} - \psi_{monetary} & \text{if } I_{t} < I_{t}^{*} \\ i_{cb,t-1}^{r} & \text{otherwise,} \end{cases}$$

(7.4.2)

 $i_{cb,t}^A = i_{cb,t}^R + \psi_R$ 

(7.4.3)

(7.4.5)

#### Model characteristics

Key decision rules:

Countercyclical capital and liquidity buffers (CB)

$$CR_{t}^{T} = \begin{cases} CR_{t-1}^{T} + \psi_{prudential} & if \frac{L_{t}}{GDP_{t}} > \phi_{prudential} \\ CR_{t-1}^{T} - \psi_{prudential} & if \frac{L_{t}}{GDP_{t}} < \phi_{prudential} \\ CR_{t-1}^{T} & otherwise, \end{cases}$$
(7.4.4)

$$LR_{t}^{T} = \begin{cases} LR_{t-1}^{T} + \psi_{prudential} & if \frac{L_{t}}{GDP_{t}} > \phi_{prudential} \\ LR_{t-1}^{T} - \psi_{prudential} & if \frac{L_{t}}{GDP_{t}} < \phi_{prudential} \\ LR_{t-1}^{T} & otherwise, \end{cases}$$
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### Model characteristics

Key decision rules

**Bank lending** 

- Interest on loans  $i_{bnk,t}^{L} = \begin{cases} (\overline{\iota}_{bnk,t-1}^{L} + \Delta f u c_{x,t}^{e})(1+FN) & \text{if } CR_{bt} < CR_{t}^{T} \\ (\overline{\iota}_{bnk,t-1}^{L} + \Delta f u c_{x,t}^{e})(1-FN) & \text{otherwise.} \end{cases}$ (7.3.3)

$$i_{bt}^{D} = \begin{cases} i_{bt-1}^{-d} (1 - FN) \ if \ LR_{bt} \ge LR_{t} \\ i_{bt-1}^{-d} (1 + FN) \ otherwise. \end{cases}$$
(7.3.5)

- Dividends

$$div_{bnk,t} = \begin{cases} (1+\alpha^d)(\rho_b * prof) \ if \ CR_{bt} > CR_t^T \\ \rho_b * prof, \ otherwise. \end{cases}$$
(7.3.10)

- Elastic supply and demand

- Interest on deposits

#### Model characteristics

Key Decision rules

The interbank market

Per-period interest on overnight loans
(subject to maximum CB advances rate)

$$i_{bt}^{ib} = (\overline{i}_{bt}^l - i_{bt}^{cb}) / \overline{maturity},$$

- Supply/Demand interbank loans: actual - desired liquidity ratio

$$I_{bt}^{S} = \left( LR_{bt} - LR_{bt}^{d} \right) * D_{bt}$$

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### Model characteristics

Key decision rules

- Household consumption: income, inflation expectations, wealth

$$c_{hh,t}^{D} = \alpha^{y} \frac{y_{hh,t}}{I_{hh,t}^{e}} + \alpha^{q} \frac{q_{hh,t}}{I_{hh,t}^{e}},$$
(7.1.2)

- Wages: backward-looking, with unemployment threshold

$$w_{hh,t}^{d} = \begin{cases} w_{hh,t-1}^{d} (1 - FN) \ if \ \sum_{n=1}^{4} u_{hh,t-n} > \varphi_{u} \\ w_{hh,t-1}^{d} (1 + FN) \ if \ \sum_{n=1}^{4} u_{hh,t-n} \le \varphi_{u} \ and \ U_{t} \le \varphi_{U}, \end{cases}$$
(7.1.1)

#### Model characteristics

Key decision rules

Firms

- Price: costs + mark-up, dependent on inventories

$$p_{x,t}^{N} = (1 + \psi_{x,t}^{ulc}) \frac{ulc_{xt}^{e} l_{xt}^{d}}{o_{xt}^{D}},$$
(7.2.3)

$$\Psi_{x,t}^{ulc} = \begin{cases} \Psi_{x,t-1}^{ulc} (1+FN) \ if \ \frac{inv_{xt-1}}{inv_{x,t}^d} \le \upsilon^N \\ \Psi_{x,t-1}^{ulc} (1-FN) \ if \ \frac{inv_{xt-1}}{inv_{x,t}^d} > \upsilon^N. \end{cases}$$
(7.2.4)

# Simulation Sequence





#### Simulation Sequence



*Firms are heterogeneous and distributions shift over time* 



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### Simulation Sequence



#### Simulation Sequence



interaction II: consumption, interest, bonds, loan repayment; wages, benefits, taxes, defaults





### Model characteristics and dynamics

Model calibration and initialization

Agents' state variables: initially stock-flow consistent All debtors have creditors

Model-wide variables: initially steady-state inflation, GDP, wages, unemployment, interest

**Parameters:** realistic

CB advances rate = .25, inflation target = 2%

### Monetary policy

- Initially no impact
- Explicit transmission mechanism modelling
  - Interest rates
  - Prices and Wages
  - Investment and Consumption
- Arestis and Sawyer (2006)
  - "We find that the impact of changes in the rate of interest has a weak effect on inflation (of the order of 0.2–0.3% following a 1% change in the discount rate), while there are more substantial effects on real variables, especially on investment, which thereby affects the future capital stock"

### Monetary policies

- Fixed interest rates
  - Low and High
- Shock
  - Small and Large

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#### Impacts on interests rates

AverageInterestDeposits







### Credit and Unemployment

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#### TotalCredit



#### unemployment

#### Prices and GDP



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### Summary Next steps

- Better model design
- More detailed study of model dynamics
- More rigorous model validation
- General sensitivity analysis
- More refined policy experiments

- Adding a housing market
- Adding proper labour market and income distribution

### Thank you for listening

#### Questions & feedback?

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- Outputs:
  - **Develop "tools"** to handle the heterogeneity of stocks and agents involved in real & financial transactions: (JMAB).
  - Set "standards" to build, calibrate, and validate models.
  - Define a (relatively) simple, general, flexible model to serve as "benchmark".

# Java Macroeconomic Agent-Based toolkit

- **Object Oriented Programming** leads to modularity, flexibility and re-usability.
- Event Based Approach: possibility of asynchronous decisions and different economic processes/interactions frequencies.
- Explicit Balance Sheet Modelling: Agents' Stock Matrices
  - Helps in ensuring the SFC
  - Flexible tool to store information and manage heterogeneity
  - Helps tracking multi-layered networks and balance sheets interdependencies
- Automatic procedures to ensure that Copeland's quadruple entry principle is respected.
- Fully scalable view of models' dynamics

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### From micro to meso to macro

JMAB...

- provides a comprehensive representation of the complex dynamic network linking agents' balance sheets and its evolution through time as transactions between different agents occur. This allows:
  - network analysis
  - fragility analysis
- provides an overall balance sheet and flows of funds representation of the economy allowing for
  - more traditional analysis at the macroeconomic level
  - synthetic measures to assess the state of the economy and its future evolution

### More concretely





### Evolving credit network



- Red: consumption firms
- Black: capital firms

