

# Credit Frictions and the Extensive Margin <sup>1</sup>

Incomplete and very preliminary!

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<sup>1</sup>The views expressed do not necessarily reflect those of the Federal Reserve Bank of Dallas, or the Federal Reserve System.

# Introduction

## Objective:

- Examine the interaction between credit frictions, firm entry and exit, and macroeconomic activity
  - Credit frictions that arise due to asymmetric information
  - Economic activity on the extensive margin (firm entry and exit) and intensive margin (input), both depend on credit availability

# Introduction

Model that builds on:

- Financial accelerator
  - Bernanke and Gertler (1989), Calrstrom and Fuerst (1997), Bernanke, Gertler, Gilchrist (1999)
- Firm entry and exit
  - Ghironi and Melitz (2007), Bilbiie, Ghironi, and Melitz (2012)
- Similar to:
  - Poutineau and Vermandel (2015) - bounded rationality
  - Bergin, et al (2014) - collateral constraint

# This talk

## Outline

- Empirical evidence on credit spreads and entry
- Brief overview of model
- Explore long-run properties (steady state)
- Wedge analysis

# Preliminary empirics: data

- Data: 1981-2019
  - risk spread: BAA-10yrTbond
  - TFP, real GDP and investment growth
  - log birth rates (establishments) ('93 on)
  - log death rates (establishments) ('93 on)
  - Annual data on birth and death rates and on TFP dispersion

# Contemporaneous cross-correlations

**Table 1. Contemporaneous Correlations**

| <b>Variable</b> | TFP<br>growth | GDP<br>growth | Investment<br>growth | Spread | Birth<br>rate | Death<br>rate |
|-----------------|---------------|---------------|----------------------|--------|---------------|---------------|
| TFP growth      | 1.00          | 0.74          | 0.45                 | -0.19  | 0.10          | -0.07         |
| GDP growth      |               | 1.00          | 0.71                 | -0.48  | 0.37          | -0.22         |
| Invest. growth  |               |               | 1.00                 | -0.51  | 0.31          | -0.42         |
| Spread          |               |               |                      | 1.00   | -0.61         | 0.12          |
| Birth rate      |               |               |                      |        | 1.00          | 0.34          |
| Death rate      |               |               |                      |        |               | 1.00          |

## Preliminary empirics: correlations (Table 1)

- Cross correlations: Birth and death rates and economic activity
  - Positive correlation between real GDP, investment growth and birth rate
  - Negative correlation between real economic activity and death rate

# Preliminary empirics: correlations (Table 1)

- Cross correlations with Spread
  - Strong negative correlation between spread and real economic activity (GDP, investment)
  - Even stronger negative correlation between spread and entry
  - Weak positive correlation between spread and exit



## Preliminary empirics: Lead/lags (Table 2)

- Lead/lag correlations with Spread
  - Birth rate Lead correlation arguably stronger than contemporaneous correlation

# Contemporaneous cross-correlations

**Table 2. Cross-Correlations Leads and Lags**

| Cross-Correlations with Spread |       |       |       |       |       |       |       |
|--------------------------------|-------|-------|-------|-------|-------|-------|-------|
| Variable                       | Leads |       |       |       | Lags  |       |       |
|                                | 3     | 2     | 1     | 0     | 1     | 2     | 3     |
| TFP growth                     | 0.17  | 0.15  | 0.03  | -0.19 | -0.25 | -0.22 | -0.20 |
| GDP growth                     | -0.03 | -0.12 | -0.29 | -0.48 | -0.50 | -0.45 | -0.39 |
| Invest.growth                  | -0.00 | -0.13 | -0.35 | -0.51 | -0.50 | -0.45 | -0.38 |
| Spread                         | 0.55  | 0.70  | 0.88  | 1.00  | 0.88  | 0.70  | 0.55  |
| Birth rate                     | -0.67 | -0.65 | -0.65 | -0.61 | -0.55 | -0.49 | -0.45 |
| Death rate                     | -0.16 | -0.06 | 0.05  | 0.12  | 0.14  | 0.14  | 0.13  |

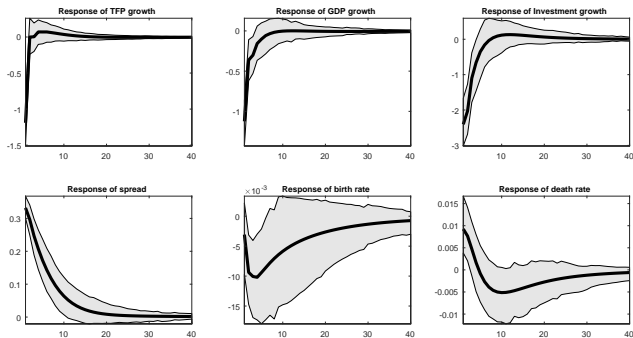
# Preliminary empirics: Mixed Frequency VAR

- Quarterly variables: 1981-2019
  - TFP, GDP, Investment growth
  - BAA-10yrTbond spread
  - Establishment birth and death rates (post '93)
- Annual variables: 1981-2019
  - Establishment birth and death rates
  - Micro-uncertainty: dispersion in firm TFP (detrended)

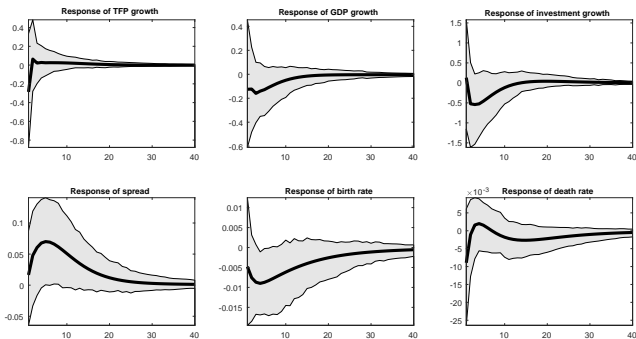
# Preliminary empirics: Mixed Frequency VAR

- State space model
  - State equations: 7 variables in quarterly VAR
    - TFP, GDP, investment growth, spread, birth rate, death rate, micro-uncertainty
    - model micro-uncertainty strictly exogenous
  - Observation equation: 6 quarterly, 3 annual
    - Impose relationship between quarterly and annual variables
- Bayesian estimation
  - Modified Minnesota priors

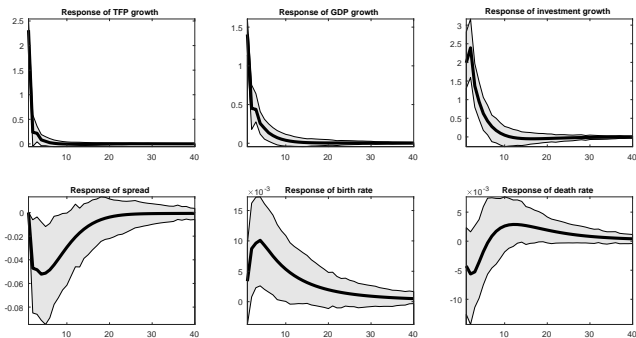
# Mixed Frequency VAR impulse responses: spread shock



# Mixed Frequency VAR impulse responses: micro-uncertainty shock



# Mixed Frequency VAR impulse responses: TFP shock



# Preliminary empirics: Mixed Frequency VAR

- Summary of results
  - Spread shocks (positive):
    - Declines in GDP and investment (TFP less so)
    - Decline in birth rate and increase in death rate
  - Micro-uncertainty:
    - Very imprecise effects
  - Entry and exit rates respond to economic activity



# Model overview

## Features of model

- Credit frictions due to asymmetric information:
  - Intensive margin
    - borrow working capital to pay inputs
    - borrow to finance investment projects
  - Extensive margin: firm entry and exit
    - "supply of new entrants"
    - exit as a result of default
    - credit frictions affect "demand for new entrants"
- Three spreads:
  - working capital loans
  - entry loans
  - investment loans

# Model Overview: Working capital

- Existing firms
  - Must pay inputs before producing
  - Borrow working capital to pay inputs that cannot be paid from retained earnings
  - Degree of credit frictions depends on amount of micro-uncertainty and cost of monitoring
  - Incentive to hold retained earnings (not pay dividends)
- Credit frictions affect the cost of production and profits, hence, demand for entry

## Model overview: Entry

- Combination of Carlstrom and Fuerst (1997) and Bilbiie, Ghironi, and Melitz (2012)
- Entrepreneurs:
  - Create firms
  - Obtain resources from net worth and loans
  - Degree of credit frictions depends on amount of uncertainty and cost of monitoring
- Credit frictions affect the cost of "entry services" and, hence, the supply of entry

## Details: Production firms

- Face (inverse) Dixit-Stiglitz demands:  $\rho_t(\epsilon) = \left(\frac{y_t(\epsilon)}{Y_t}\right)^{\frac{-1}{\theta}}$ 
  - $\rho_t(\epsilon) = \frac{p_t(\epsilon)}{P_t}$
  - $Y_t = \left[\int_0^{N_t} y_t(\epsilon)^{\frac{\theta-1}{\theta}} d\epsilon\right]^{\frac{\theta}{\theta-1}}$
  - $P_t = \left[\int_0^{N_t} p_t(\epsilon)^{1-\theta} d\epsilon\right]^{\frac{1}{1-\theta}}$
- Firm output,  $y_t(\epsilon) = \epsilon_t y_t$ 
  - $\epsilon_t$  - idiosyncratic productivity (private information)
  - $y_t = z_t h_t^\alpha k_t^{(1-\alpha)}$ , common across firms
- Firm revenue:
  - $\epsilon_t^{\left(\frac{\theta-1}{\theta}\right)} y_t^{\left(\frac{\theta-1}{\theta}\right)} Y_t^{\frac{1}{\theta}}$

# Production firms

- Must pay input costs  $(w_t h_t + r_{k,t} k_t)$  before observing  $\epsilon_t$
- Finance working capital from borrowing and past retained earnings
- Past retained earnings
  - $a_{F,t} = x_t(1 + r_{w,t})W_t$ 
    - $x_t$  is firm's share of aggregate wealth
    - $(1 + r_{w,t})W_t$  is gross return on aggregate wealth

# Production firms

- Default on loan if revenue fails to cover loan costs:
  - Define  $\bar{\epsilon}_t$  :
 
$$\bar{\epsilon}_t^{\frac{(\theta-1)}{\theta}} y_t^{\frac{(\theta-1)}{\theta}} Y_t^{\frac{1}{\theta}} = (1 + r_{F,t})(w_t h_t + r_{k,t} k_t - a_{F,t})$$
  - Default if:  $\epsilon_t < \bar{\epsilon}_t$
- Costly to observe for financial intermediaries ( $\mu_F$ )
  - Only monitor if firm claims default

## Production firms: loan contract

- Share of total output going to non-defaulting firms:  $f_\epsilon(\bar{\epsilon}_t)$
- Share of total output going to financial intermediaries,  $g_\epsilon(\bar{\epsilon}_t)$ , includes:
  - Includes loans repaid by non-defaulting firms
  - Includes values of defaulting firms' output minus monitoring costs

# Production firms: optimal loan contract

- Contract satisfies:
  - $(\frac{y_t}{Y_t})^{(-\frac{1}{\theta})} = m(\bar{\epsilon}_t)\lambda_t^C$ 
    - like setting "planned" price to be a markup over MC
    - $\lambda_t^C$  is marginal cost
    - $m(\bar{\epsilon}_t)$  is markup
  - output depends on firm net worth (retained earnings):
 
$$y_t = \frac{a_{F,t}}{(1-m(\bar{\epsilon}_t)g_{\epsilon}(\bar{\epsilon}_t))\lambda_t^C}$$
  - default cutoff ( $\bar{\epsilon}_t$ ) depends on net worth ( $a_{F,t}$ )



## Production firms: optimal retained earnings

- Choose retained earnings,  $x_{F,t+1}$ , to maximize PV of dividends
- Tradeoff between current dividends and future output (future dividends)
- Firm current dividends:  $d_t =$ 

$$\left( \epsilon_t^{\frac{\theta-1}{\theta}} - \bar{\epsilon}_t^{\frac{\theta-1}{\theta}} \right) \frac{m(\bar{\epsilon}_t)}{1 - m(\bar{\epsilon}_t)g_\epsilon(\bar{\epsilon}_t)} x_{F,t} (1 + r_{w,t}) W_t - x_{F,t+1} W_{t+1}$$
- optimal retained earnings depends on:
  - markup
  - extent of credit frictions

# Aggregate output

- $Y_t = (f_\epsilon(\bar{\epsilon}_t) + g_\epsilon(\bar{\epsilon}_t))^{\frac{\theta}{\theta-1}} N_t^{\frac{\theta}{\theta-1}} y_t$ 
  - $y_t$  per firm "planned" output
  - $(f_\epsilon(\bar{\epsilon}_t) + g_\epsilon(\bar{\epsilon}_t))^{\frac{\theta}{\theta-1}}$  reflects the output loss due to firm defaults
  - $N_t$  number of producing firms

# Firm Dynamics

- total number of firms:

$$N_{t+1} = (1 - \delta)(1 - \Phi_\epsilon(\bar{\epsilon}_t))N_t + (1 - \delta)N_t^0$$

- number of new entrants:  $N_t^0$
- exogenous death rate,  $\delta$ .
- working capital default probability =  $\Phi_\epsilon(\bar{\epsilon}_t)$
- birth rate:  $N_t^0 / N_t$
- death rate:  $\Phi_\epsilon(\bar{\epsilon}_t) + \delta(1 - \Phi_\epsilon(\bar{\epsilon}_t)) + \delta \frac{N_t^0}{N_t}$

# Entrepreneurs and supply of new firms

## Entrepreneurs:

- Provide "Entrepreneurial services"
  - Input in the creation of firm: fixed cost of creating a firm,  $F_{E,t}$
  - Must borrow to finance production of entrepreneurial services
  - Entrepreneur productivity asymmetric information
  - Optimal loan contract similar to working capital contract (also similar to Calstrom and Fuerst).

## Supply of entry services

- expected payoff to financial intermediaries:  $p_{E,t}g_{\omega}(\bar{\omega}_t)E_t$
- expected payoff to entrepreneurs:  $p_{E,t}f(\bar{\omega}_t)E_t$
- $E_t$  depends on entrepreneur net worth,  $A_{E,t}$
- total supply of entrepreneurial services produced:
  - $(f_{\omega}(\bar{\omega}_t) + g_{\omega}(\bar{\omega}_t))E_t = (1 - \mu_E)\Phi_{\omega}(\bar{\omega}_t)E_t$

## Demand for new firms: Entry

- free entry:  $v_t = p_{E,t} F_{E,t} + x_{t+1} W_{t+1}$ 
  - $v_t$  = value of firm in initial public offering
  - $x_{t+1} W_{t+1}$  = funds required to finance 1st period working capital
  - Cost of entry:  $p_{E,t} F_{E,t}$ 
    - $p_{E,t}$  = price of entrepreneurial services
    - $F_{E,t}$  = fixed amount of entry services required to create firm
    - allow for congestion effects  $F_{E,t} = z_{E,t} \left( \frac{N_t^0}{N_{SS}^0} \right)^\tau$

## Rest of model

- Households rent labor and capital to production firms
- Market clearing conditions for:
  - labor
  - capital rental market
  - consumption good
  - entrepreneurial services
  - investment services

# Model: Calibration

- Table 3
- Use values of Carlstrom and Fuerst (1997) and Bilbiie et al (2012).
- Normalize  $z_{SS}$  and  $f_{E,SS}$  so that  $y_{SS} = 1$  and  $N_{SS} = 1$



## Steady state analysis: Table 4

- Baseline vs no credit frictions
  - Steady state ratios plausible (?)
  - Retained earnings 85% of earnings (vs 0% with no credit frictions)
- Examines how steady state changes if 20% increase over baseline values
  - TFP and increase in demand for variety (markup):
    - large effects on: number of firms, GDP
  - fixed entry costs and exogenous death rates:
    - large effects on: number of firms, GDP, consumption
    - valuation ratio falls with increase in death rate
  - micro-uncertainty
    - small effects on: number of firms, GDP
    - large effect on spreads

# Steady state analysis: Table 4

Table 4. Steady State Sensitivity Analysis

| Variable                         | Baseline | No credit frictions | 20% increase in baseline specification |        |            |                      |                         |               |                    |             |
|----------------------------------|----------|---------------------|--|--------|------------|----------------------|-------------------------|---------------|--------------------|-------------|
|                                  |          |                     | TFP                                    | Markup | Entry Cost | Exogenous Death Rate | Working Capital Uncert. | Entry Uncert. | Investment Uncert. | All Uncert. |
|                                  | (1)      | (2)                 | (3)                                    | (4)    | (5)        | (6)                  | (7)                     | (8)           | (9)                | (10)        |
| GDP                              | 1.005    | 1.048               | 1.4                                    | 1.94   | 0.972      | 0.977                | 1.008                   | 1.005         | 1.004              | 1.006       |
| Per firm output ( $y$ )          | 1        | 0.887               | 0.967                                  | 0.232  | 1.226      | 1.174                | 0.978                   | 1.004         | 1                  | 0.982       |
| Number of firms ( $N$ )          | 1        | 1.163               | 1.393                                  | 5.082  | 0.806      | 0.842                | 1.023                   | 0.996         | 0.998              | 1.017       |
| Birth rate (x100)                | 2.596    | 2.302               | 2.596                                  | 2.642  | 2.596      | 3.155                | 2.519                   | 2.596         | 2.596              | 2.519       |
| Price/dividend ( $v/d$ )         | 27.475   | 29.984              | 27.475                                 | 27.116 | 27.475     | 23.761               | 28.089                  | 27.475        | 27.475             | 28.089      |
| Spread entry loans (%)           | 1.871    | 0                   | 1.871                                  | 1.871  | 1.871      | 1.871                | 1.871                   | 2.301         | 1.871              | 2.301       |
| Spread working capital loans (%) | 1.871    | 0                   | 1.871                                  | 1.607  | 1.871      | 2.320                | 2.127                   | 1.871         | 1.871              | 2.127       |
| Spread investment loans (%)      | 1.871    | 0                   | 1.871                                  | 1.871  | 1.871      | 1.871                | 1.871                   | 1.871         | 2.301              | 2.301       |
| Investment share of GDP          | 0.221    | 0.226               | 0.221                                  | 0.184  | 0.221      | 0.221                | 0.221                   | 0.221         | 0.221              | 0.212       |
| Entry costs share of GDP         | 0.065    | 0.063               | 0.065                                  | 0.174  | 0.065      | 0.068                | 0.064                   | 0.065         | 0.065              | 0.064       |
| Retained earnings ratio          | 0.858    | 0                   | 0.858                                  | 0.654  | 0.858      | 0.852                | 0.867                   | 0.858         | 0.858              | 0.867       |
| Working capital share of loans   | 0.499    | 0.759               | 0.499                                  | 0.527  | 0.499      | 0.509                | 0.387                   | 0.504         | 0.517              | 0.411       |
| Investment share of loans        | 0.387    | 0.189               | 0.387                                  | 0.243  | 0.387      | 0.375                | 0.474                   | 0.391         | 0.365              | 0.457       |
| Per firm mark-up                 | 1.122    | 1.1                 | 1.122                                  | 1.375  | 1.122      | 1.126                | 1.123                   | 1.122         | 1.122              | 1.123       |

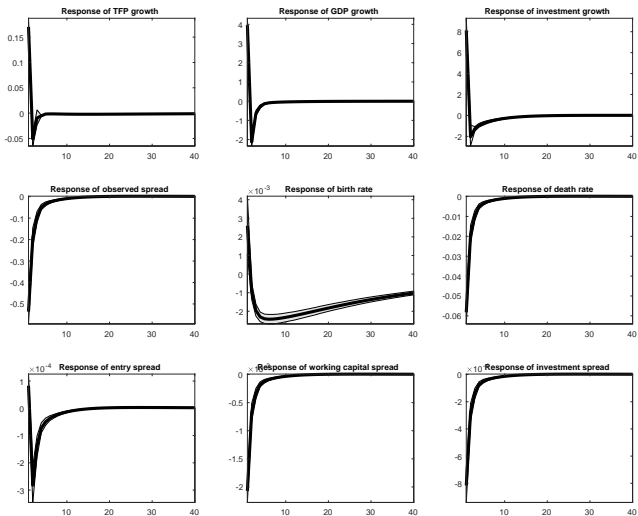
## Wedge analysis

- Introduce "shocks" into model
  - TFP, entry costs ( $f_{E,t}$ ), exogenous death rate, micro-uncertainty about entrepreneur and firm productivity (common), discount rate, labor wedge (supply), and marginal efficiency of investment
  - independent, AR(1) processes.
- Estimate shock process using Bayesian methods
  - observables: same as mixed frequency VAR
  - observable spread = weighted average of the three model spreads
  - quarterly data: 1981:1-2019:4
  - allow for missing observations

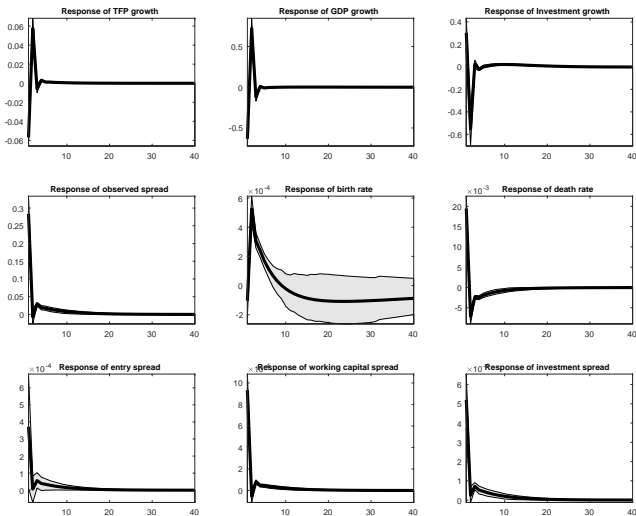
# Impulse responses

- Shock to discount factor (increase): Figure 4
  - persistent decrease in spreads (except entry)
  - increases in TFP, GDP, Investment growth
- Shock to micro-uncertainty: Figure 5
  - spreads rise
  - deaths rise, birth fall on impact (complicated dynamics)
  - TFP, GDP, Investment growth mixed ("zig-zags")
- Shock to TFP: Figure 6
  - TFP, GDP, Investment growth increases
  - Births rise
  - Spreads mixed response ("zig-zag")

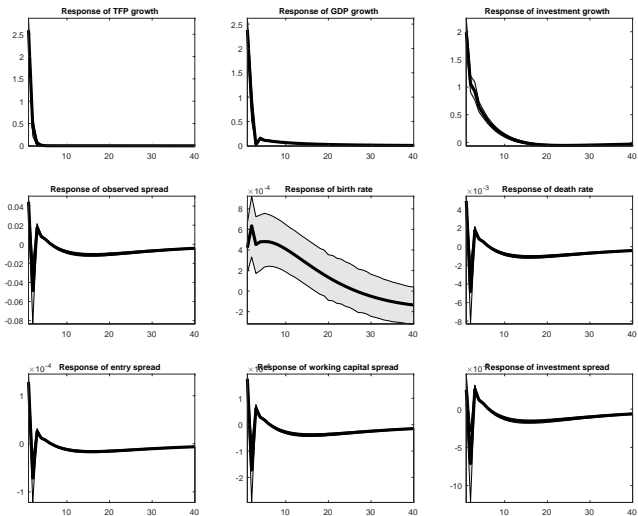
# Structural model impulse responses: discount factor shock



# Structural model: micro-uncertainty shock



# Structural model impulse responses: TFP shock



## Model correlations: Table 5

- Spread:
  - negative correlation with TFP, GDP, investment growth
  - very weak correlation with birth rate
  - too strong correlation with death rate
- Birth rate:
  - model correlations too small
- Death rate:
  - correlations with economic activity not so bad
  - correlation with spread much too large



# Model cross-correlations

**Table 5. Contemporaneous Correlations Implied by the Model**

| Variable          | Correlation with Spread: |          | Correlation with Birth rate: |          | Correlation with Death rate: |          |
|-------------------|--------------------------|----------|------------------------------|----------|------------------------------|----------|
|                   | Data                     | Baseline | Data                         | Baseline | Data                         | Baseline |
| TFP growth        | <i>-0.19</i>             | -0.02    | <i>0.10</i>                  | 0.04     | <i>-0.08</i>                 | -0.03    |
| GDP growth        | <i>-0.48</i>             | -0.35    | <i>0.37</i>                  | 0.06     | <i>-0.22</i>                 | -0.25    |
| Investment growth | <i>-0.51</i>             | -0.26    | <i>0.31</i>                  | 0.10     | <i>-0.42</i>                 | -0.21    |
| Spread            | <i>1.00</i>              | 1.00     | <i>-0.61</i>                 | 0.03     | <i>0.12</i>                  | 0.68     |
| Birth rate        | <i>-0.61</i>             | 0.03     | <i>1.00</i>                  | 1.00     | <i>0.34</i>                  | 0.10     |
| Death rate        | <i>0.12</i>              | 0.68     | <i>0.34</i>                  | 0.10     | <i>1.00</i>                  | 1.00     |

## Model correlations: Table 6

- Model spreads vs observed spread:
  - Working capital and investment spreads highly correlated with observed spread
  - entry spread much less so
- working capital and investment spreads
  - similar correlations with TFP, GDP, and investment
- entry spreads
  - substantial positive correlations with TFP, GDP, investment, and birth rates—counterfactual

# Model cross-correlations

Table 6. Unobserved Spread Correlations from the Model

| observable<br>variable | Correlation with: |                           |                      |                       |
|------------------------|-------------------|---------------------------|----------------------|-----------------------|
|                        | Entry<br>spread   | Working capital<br>spread | Investment<br>spread | Micro-<br>uncertainty |
| TFP growth             | 0.09              | -0.01                     | -0.05                | -0.00                 |
| GDP growth             | 0.25              | -0.38                     | -0.35                | -0.01                 |
| Investment growth      | 0.47              | -0.33                     | -0.20                | -0.01                 |
| Spread                 | 0.39              | 0.99                      | 0.96                 | 0.26                  |
| Birth rate             | 0.30              | 0.01                      | -0.02                | 0.00                  |
| Death rate             | 0.16              | 0.72                      | 0.55                 | 0.03                  |
| Entry spread           | 1.00              | 0.31                      | 0.35                 | 0.24                  |
| Work Cap. spread       |                   | 1.00                      | 0.93                 | 0.22                  |
| Invest. spread         |                   |                           | 1.00                 | 0.32                  |

# Model: Summary

- Model missing the mark on entry:
  - entry spread driven by demand for entry services
  - entry relies on fluctuations in exogenous entry costs
- Death rate too correlated with working capital defaults:
  - fluctuations in discount factor important for spread, GDP, investment, deaths
    - role for monetary policy (?)

## Possible directions for future work

- Quantitative analysis
  - Drop TFP dispersion measure
    - Doesn't seem to add much to atheoretical or model empirics
  - better measurement of extent of credit frictions
    - spread on entry – (venture capital ?)
    - spread on working capital (lines of credit?)

## Possible directions for future work

- Model features:
  - Add non-default endogenous exit
  - New Keynesian nominal frictions
  - News shocks