

Turbulent Business Cycles

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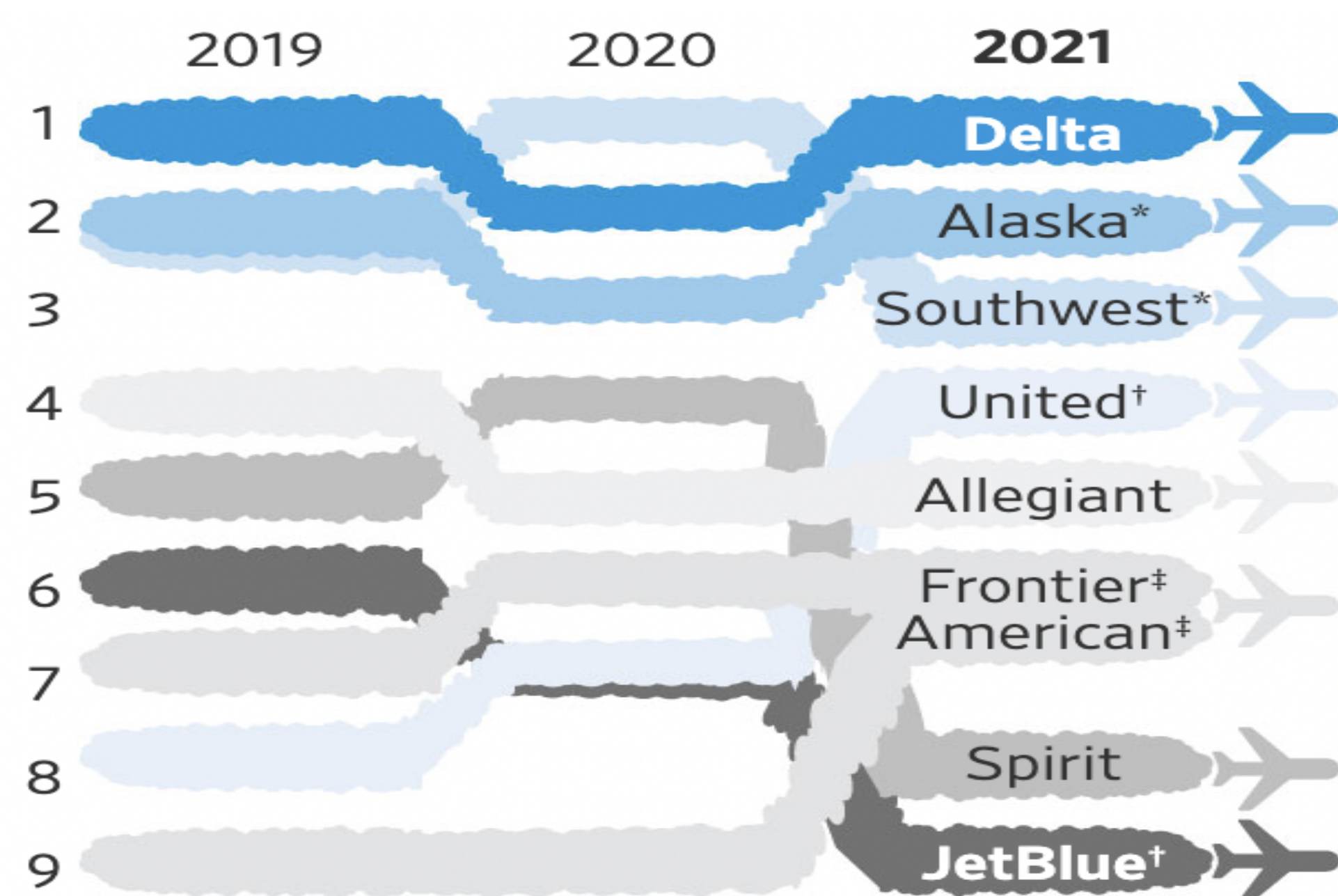
Highlight

Increases in risk of firms' productivity reshuffle ("turbulence") generate recession through a misallocation channel.

- Turbulence is associated synchronized and persistent declines in aggregate activity
- Turbulence is associated with resource reallocation from high- to low-productivity firms
- Misallocation effect of turbulence is amplified by credit frictions
- A RBC model with hetero. firm and credit friction shows underlying transmission mechanism and quantifies the impact of turbulence shock

What Is Turbulence ?

Turbulence measures time-varying risk of reshuffle in firms' productivity ranking.



*Tied in 2019 †Tied in 2020 ‡Tied in 2021
Sources: Anuvu; Transportation Department

Figure 1: Example: Turbulent Airline Industry

Measuring Turbulence

Turbulence is measured as the (inverse of) Spearman correlations of firms' productivity rankings between adjacent years.

- Consider firm-level TFP process

$$z_{j,t+1} = \begin{cases} z_{j,t} & \text{with prob } \rho_t, \\ \tilde{z} & \text{with prob } 1 - \rho_t, \end{cases}$$

where $\tilde{z} \in \{z_1, \dots, z_J\}$ is i.i.d. drawn from $\tilde{G}(z)$

- ρ_t does NOT affect cross-section distribution of productivity (z)

- 2 steps to measure turbulence

- 1 Estimate firm-level total factor productivity (TFP) of U.S. public firms following Syverson (2004), Bloom et al. (2018) etc.
- 2 Sort the firm-level TFP within industry in each year and estimate the Spearman rank correlations between adjacent years (ρ_t).

- Turbulence measured as $1 - \rho_t$

- $1 - \rho_t = 0 \Rightarrow$ no turbulence
- $1 - \rho_t = 1 \Rightarrow$ high turbulence
- $1 - \rho_t \uparrow$: more churning in productivity
 \Rightarrow high- prod. firm less likely to remain productive
 \Rightarrow low- prod. firm less likely to remain unproductive

- Turbulence vs. Uncertainty

Firm productivity	Turbulence		Uncertainty	
	(High)	(Low)	(High)	(Low)
Con. Variance	↑	↑	↑	↑
Uncon. Variance	---	---	↑	↑
Con. Mean	↓	↑	---	---
Uncon. Mean	---	---	---	---

Turbulence is Counter-cyclical

High prod. firms are less likely to remain productive in recessions.

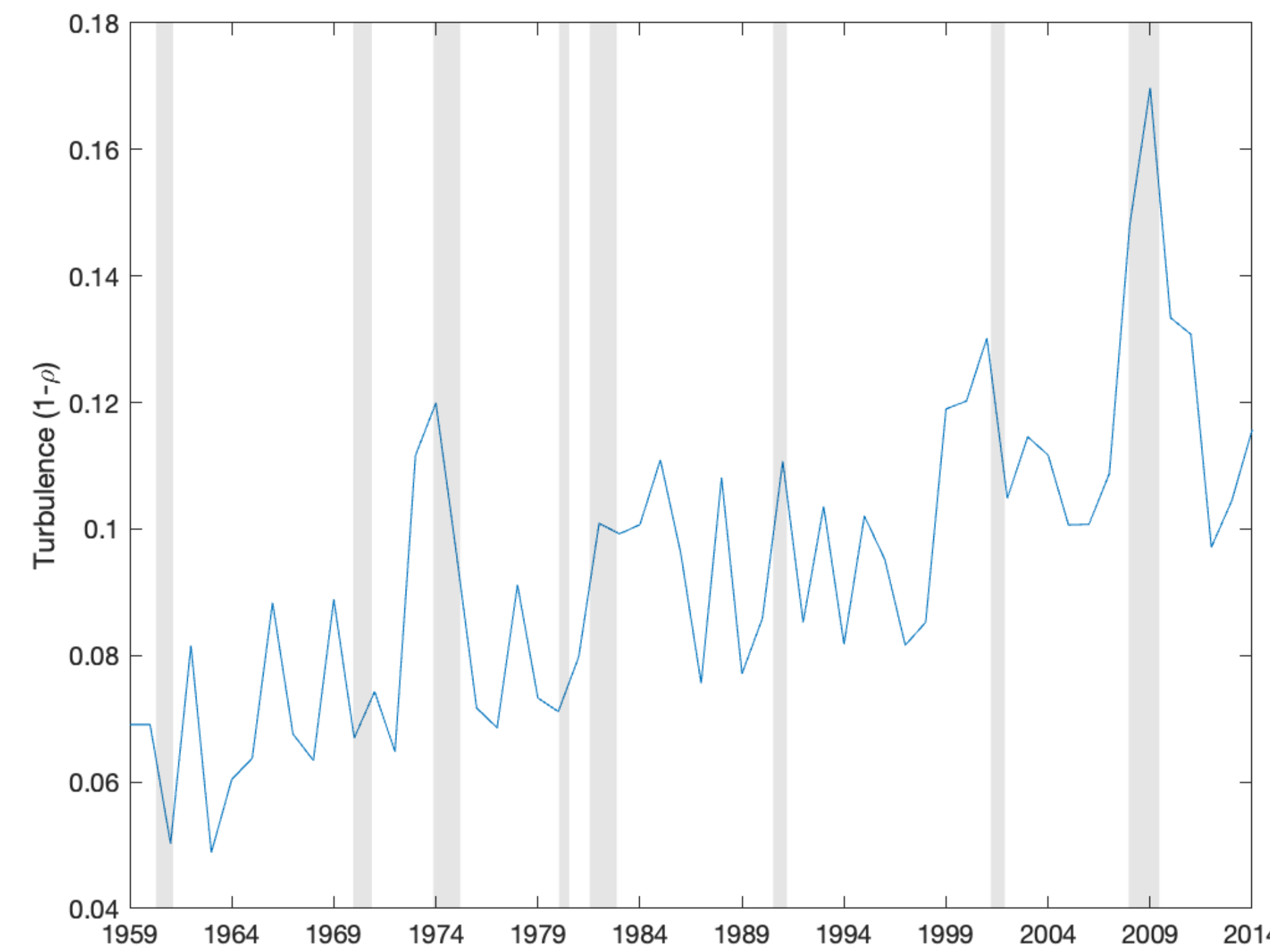


Figure 2: Micro-level Turbulence. (Data: Compustat-NBERCES)

Turbulence Associated with Recession

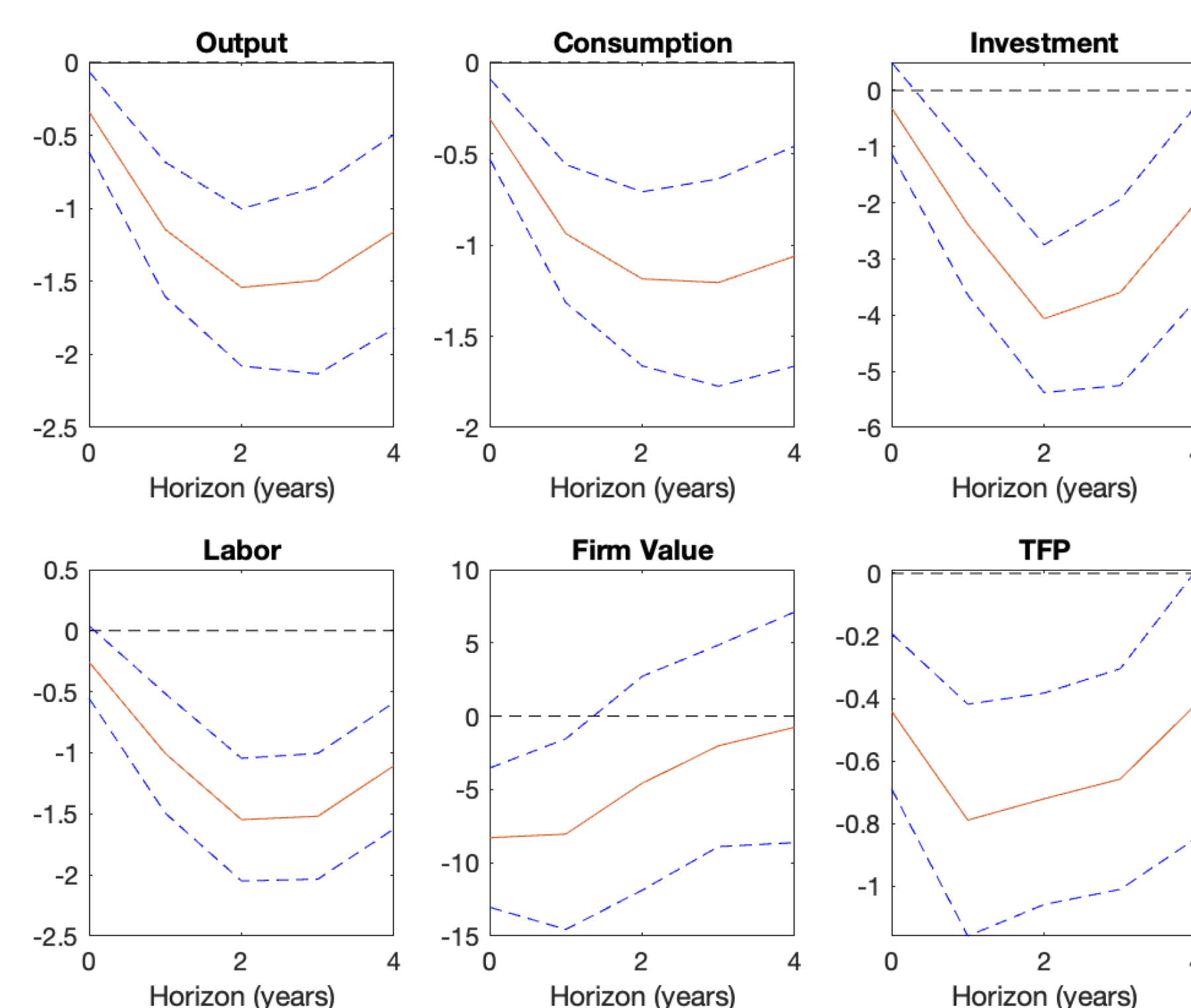


Figure 3: Estimated Response to Turbulence Shock using Local Projection

$$x_{t+h} - x_{t-1} = \beta_0^h + \beta_1^h \text{turb}_t + \beta_2^h \text{turb}_{t-1} + \beta_3^h Z_{t-1} + \epsilon_{t+h}^h,$$

- x_t : log level of GDP, C, I, H, firm value, and TFP;
- turb_t : turbulence in log units ($\log(1 - \rho_t)$);
- Z_t : vector of controls (Δ GDP, inflation, interest rate)

(Mis-)allocation Effect of Turbulence

Adverse effects of turbulence are stronger on high-productivity firms.

$$x_{jt} = \beta_0 + \beta_1 \text{High_TFP}_{jt} + \beta_2 \text{Turb}_t * \text{High_TFP}_{jt} + \mu_j + \eta_t + \epsilon_{jt},$$

- x_{jt} : YoY growth of employment, capital, value-added, or market value of firm j in year t
- $\text{High_TFP}_{jt} = 1$ if firm TFP above median
- Turb_t : turbulence measured by $1 - \rho_t$
- μ_j and η_t : firm fixed effects and year fixed effects

Credit Friction \rightarrow Reallocation Effect

Misallocation effects of turbulence are stronger in industries with higher external finance dependence.

$$x_{it} = \beta_0 + \beta_1 \text{High_FF}_{it} + \beta_2 \text{Turb}_t * \text{High_FF}_{it} + \mu_i + \eta_t + \epsilon_{it},$$

- x_{it} : IQR of employment (or capital) in industry i and year t ;
- $\text{High_FF}_{it} = 1$ iff industry's external financing dependence (KZ index) above median
- μ_i and η_t : industry and year fixed effects

RBC Model w. Turbulence Shock

Intuition is simple ...

- Heterogeneous firms facing idiosyncratic productivity
- Financial frictions: Firms finance working capital against expected equity value (Jermann-Quadrini 2012; Lian-Ma, 2021)
- Misallocation channel of turbulence
 - Turbulence $\uparrow \Rightarrow$ expected value of high-productivity firms \downarrow
 - Tightened borrowing constraints for high-productivity firms \Rightarrow reallocation toward low-productivity firms \Rightarrow TFP $\downarrow \Rightarrow$ recession

Key equations to deliver the intuition...

- Production function

$$y_{jt} = A_t z_{jt} k_{jt}^\alpha n_{jt}^{1-\alpha} \quad (1)$$

- Idiosyncratic productivity z_{jt} follows process

$$z_{j,t+1} = \begin{cases} z_{jt} & \text{with prob } \rho_t, \\ \tilde{z} & \text{with prob } 1 - \rho_t, \end{cases} \quad (2)$$

where ρ_t is turbulence shock

- Bellman equation:

$$V_t(z_{jt}, \tau_{jt}) = \max_{k_{jt}, n_{jt}} \tau_{jt} A_t z_{jt} k_{jt}^\alpha n_{jt}^{1-\alpha} - R_t k_{jt} - W_t n_{jt} + \mathbb{E} M_{t+1} V_{t+1}(z_{j,t+1}, \tau_{j,t+1})$$

s.t. credit constraint

$$R_t k_{jt} + W_t n_{jt} \leq \theta \mathbb{E} M_{t+1} V_{t+1}(z_{j,t+1}, \tau_{j,t+1}) \equiv \theta B_{jt} \quad (3)$$

where $\tau_j \sim F(\tau)$: i.i.d. distortion (Hsieh-Klenov 2009; Buera-Shin 2013)

Impact of turbulence shock

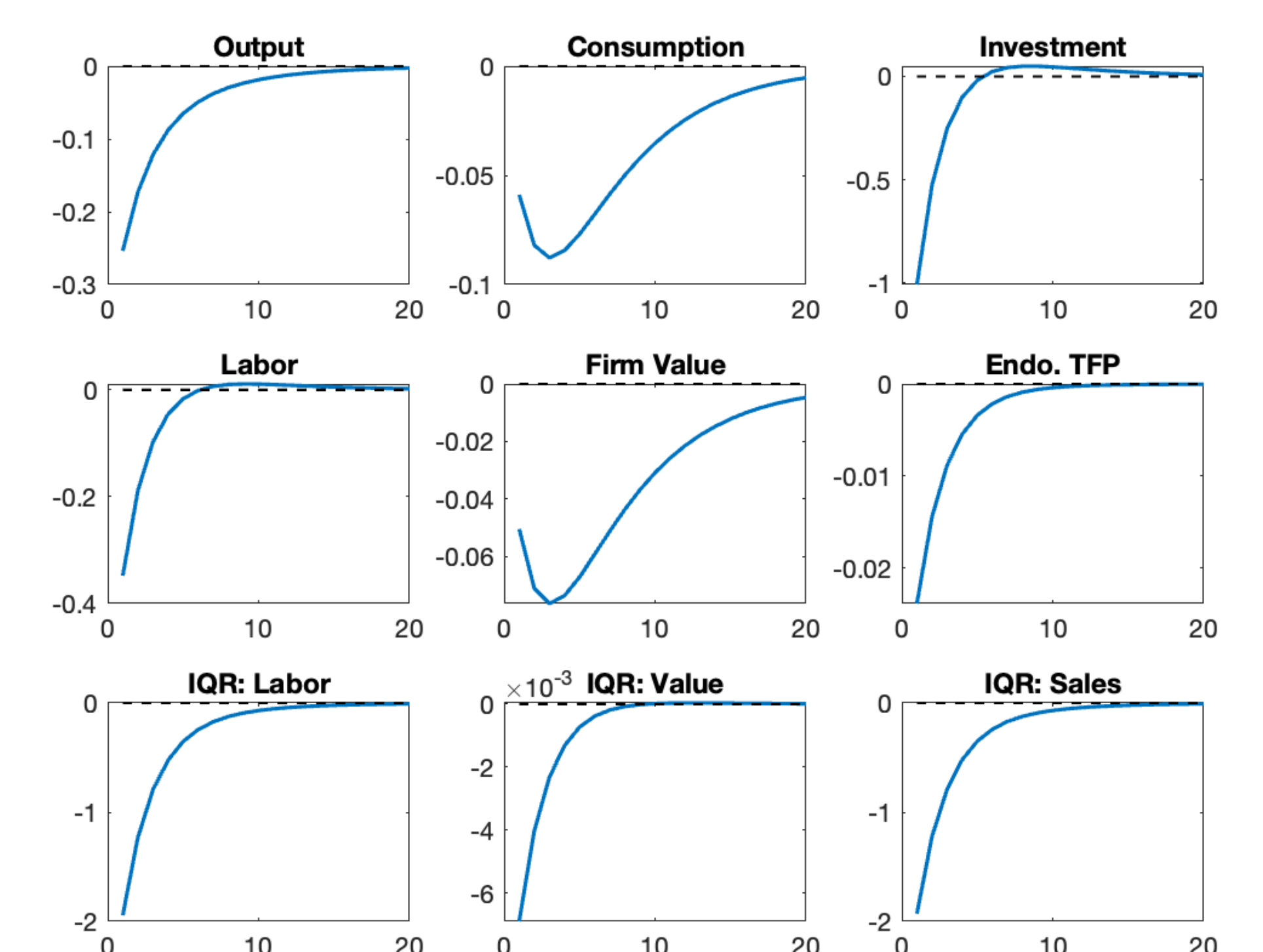


Figure 4: Impulse responses to one std turbulence shock

Credit frictions crucial for amplifying turbulence...

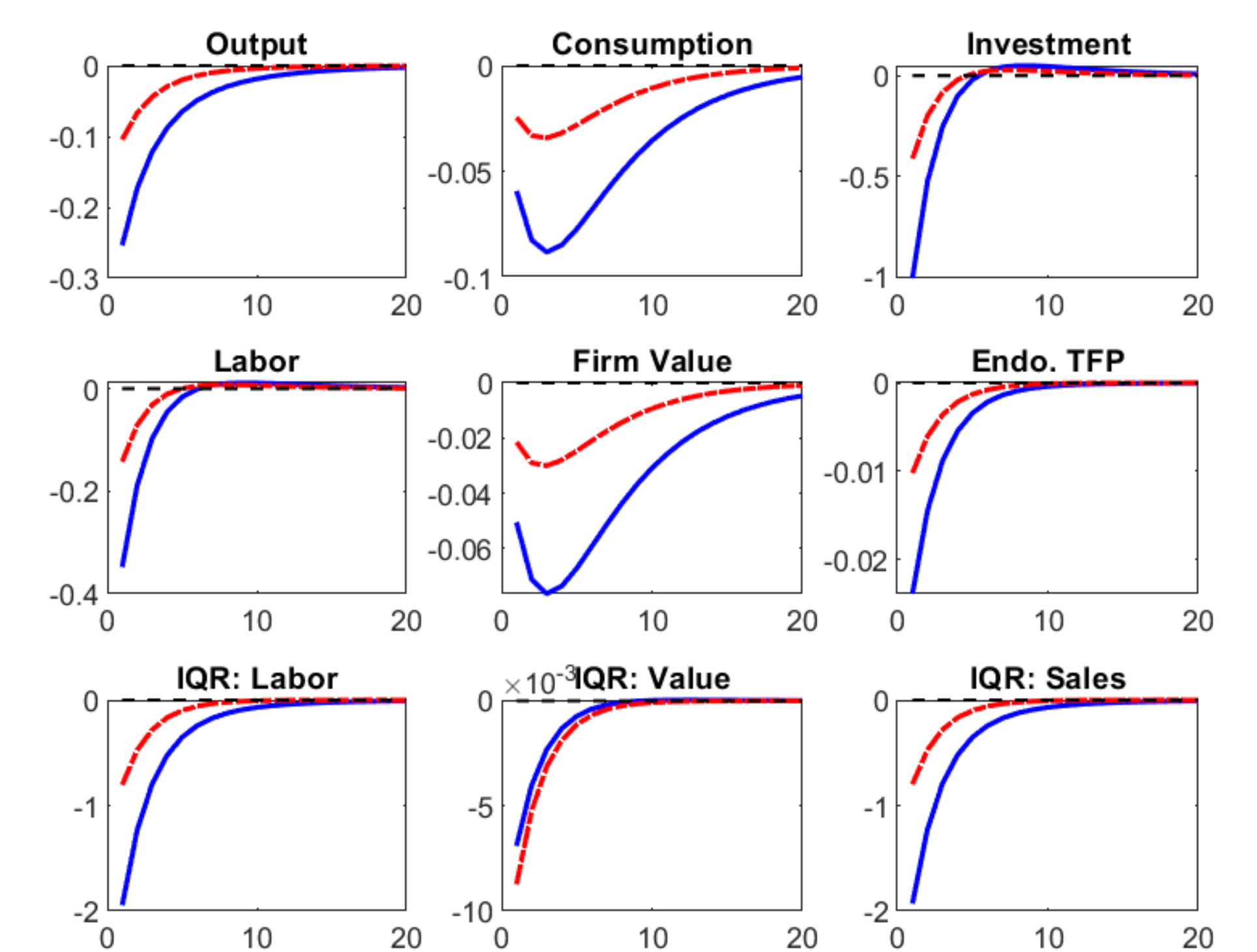


Figure 5: Counterfactual: "Quasi-fixed" borrowing limit (red lines): If borrowing limit is insensitive to firm value, impact of turbulence shock is greatly mitigated.