# Heterogeneous Impact of the Global Financial Cycle

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#### motivation

#### In global downturns

- ► investors sell foreign assets (retrenchment)
- ► prices fall more in emerging markets
- outward flows fall more in advanced economies

evidence

#### This paper: a multiple-country model to study

- ▶ joint determination of gross capital flows and asset price responses
- ► heterogeneity in exposure to global shocks

#### model

Global intermediaries + multiple countries

Main experiment: shock to risk-bearing capacity of global intermediaries

- ► countries issue risky assets
- ▶ local agents and global intermediaries trade these assets
- ► intermediaries borrow from local agents

In equilibrium: heterogeneity in wealth, different exposure to foreign demand shocks

#### mechanism and key results

#### Intermediaries seek to sell risky assets in all countries

- ► rich countries: domestic investors absorb sales by foreigners
- ▶ poor countries: low wealth → unable to replace foreign demand

#### Equilibrium implications:

- ▶ assets issued in rich countries appreciate → good substitutes for safe assets
- ▶ rich countries insure poor ones
- wealth inequality between countries rises in downturns
- ▶ global intermediaries become relatively richer in downturns

#### explaining the data

Data: outward flows and risky assets prices procyclical in both AE and EM

Estimate that financial and real shocks positively correlated

- ► real shocks (output) explain procyclicality
- ► financial shocks induce countercyclical asset prices in AE

Financial shocks explain 1/3 of variation in relative performance AE vs EM

Correlation of wealth with global aggregates is 3 times lower in AE

#### literature

Evidence of the global financial cycle and heterogeneous exposures:

Miranda-Agrippino Rey 2020,2022, Miranda-Agrippino et al 2020, Barrot Serven 2018, Habib Venditti 2019, Cerutti et al 2019, Chari et al 2020, Eguren-Martin et al 2021, Gelos et al 2022, Kalemli-Ozkan 2019

This paper: analyze heterogeneity as an equilibrium feature in a model

Models of the global financial cycle and retrenchment:

► Caballero Simsek 2020, Jeanne Sandri 2023, Morelli et al 2023, Bai et al 2019, Dahlquist et al 2023, Gourinchas et al 2022, Davis van Wincoop 2021 2023, Farboodi Kondor 2022, Kekre Lenel 2021, Sauzet 2023, Maggiori 2017

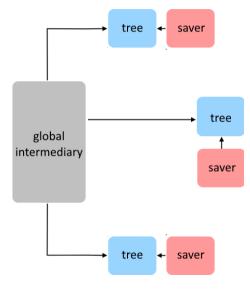
This paper: explain heterogeneity using retrenchment, study risk-sharing

#### outline

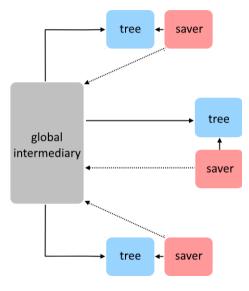
- model
- shock to risk-taking capacity of global intermediaries
- quantitative evaluation and empirical evidence



# model map



# model map



### regular countries

#### Countries $i \in [0, 1]$

- ▶ Lucas tree with price  $p_{it}$ , fixed supply of 1
- ightharpoonup cumulative yield up to t denoted by  $y_{it}$
- ▶ flow yield  $dy_{it} = v_t dt + \sigma dZ_{it}$

# problem of local savers

$$\max_{\{c_{it},\theta_{it}\}_{t\geq 0}} \mathbb{E}\left[\rho \int_0^\infty e^{-\rho t} \ln(c_{it}) dt\right]$$
s.t. 
$$dw_{it} = (r_t w_{it} - c_{it}) dt + \theta_{it} w_{it} dR_{it}$$
(2)

- ightharpoonup share  $1 \theta_{it}$  to intermediary's debt, interest rate  $r_t dt$
- ightharpoonup allocate share  $\theta_{it}$  to tree, excess returns  $dR_{it}$

$$dR_{it} = \frac{1}{p_{it}}(dy_{it} + dp_{it}) - r_t dt \equiv \mu_{it}^R dt + \sigma_{it}^R dZ_{it}$$
(3)

solution:

$$\theta_{it} = \frac{\mu_{it}^R}{(\sigma_{it}^R)^2} \tag{4}$$

#### intermediaries

Invest in trees in all countries, borrow from all savers

- ▶ assign portfolio weight  $\hat{\theta}_{it}$  to country i
- ightharpoonup issue debt  $m_t$ , pay interest  $r_t dt$
- ightharpoonup consume  $\hat{c}_t$

$$d\hat{w}_t = \int_0^1 \hat{\theta}_{it} \hat{w}_t (dR_{it} + r_t dt) di - m_t r_t dt - \hat{c}_t dt$$
 (5)

Limited risk-taking capacity: cannot fully diversify their portfolio:

- non-trivial portfolio in equilibrium
- ► time-varying capacity to take risk

#### intermediary's problem

VAR-type constraint bounds total amount of risk:

foundation

$$\int_0^1 \mathbb{V}_t[\hat{\theta}_{it}dR_{it}]di \leq \gamma_t \int_0^1 \mathbb{E}_t[\hat{\theta}_{it}dR_{it}]di$$

Portfolio and consumption choice

$$\max_{\{\hat{c}_t, m_t, f_t\}_{t \ge 0}} \mathbb{E}\left[\hat{\rho} \int_0^\infty e^{-\hat{\rho}t} \ln(\hat{c}_t) dt\right]$$

(7)

Cost parameter  $\gamma_t$  governs risk-taking capacity:

$$\hat{ heta}_{it} = \gamma_t \frac{\mu_{it}^R}{(\sigma_i^R)^2}$$

#### equilibrium

Prices  $\{p_{it}\}$ , interest rate  $r_t$ , wealth distribution, and  $\{c_{it}, \hat{c}_t, \theta_{it}, \hat{\theta}_{it}, m_t\}$  such that markets clear:

$$1 = \frac{\hat{\theta}_{it}\hat{w}_t}{p_{it}} + \frac{\theta_{it}w_{it}}{p_{it}} \quad \text{all } i \in [0, 1]$$

$$m_t = \int_0^1 w_{it} (1 - \theta_{it}) di$$
 (10)

$$\nu = \hat{c}_t + \int_0^1 c_{it} di \tag{11}$$

# equilibrium characterization

Solve for country-specific variables as functions of w and aggregate states

Prices only depend on r(t) and a global factor  $\varphi(t) = \gamma(t)\hat{w}(t)$ 

Time-varying risk premium:

$$\mu_R(w,t) = \sigma_R(w,t)^2 \cdot \frac{p(w,t)}{\varphi(t) + w} \tag{12}$$

# shock to risk-taking capacity $\gamma(t)$

Impulse response to an unanticipated jump in  $\gamma(t)$  for illustration:

$$\gamma(t) = \gamma - e^{-\mu_{\gamma}t} \Delta_{\gamma} \tag{13}$$

Immediate effect: hit global factor  $\varphi(t) = \gamma(t)\hat{w}(t)$ 

- demand for risky assets falls
- ► interest rate falls

# shock to $\gamma(t)$ : prices

Changes in asset prices on impact can be decomposed into

- ightharpoonup response to interest rate r(t)
- ightharpoonup response to global factor  $\varphi(t)$

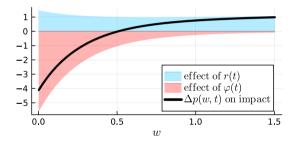
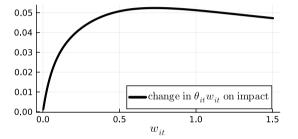


Figure: percentage changes in p(w,t) on impact.

# shock to $\gamma(t)$ : holdings

Tree holdings of domestic agents  $\theta(w,t)w$ 



 $Figure: change \ in \ tree \ holdings \ on \ impact.$ 

# adding a portfolio constaint

Now suppose there is a constraint on portfolio allocation:

$$\theta_{it} \leq \overline{\theta}$$

(14)

Risky holdings cannot exceed  $\overline{\theta}w_{it}$ 

Binds for poor countries with high returns and low wealth

# time-varying risk premium

Excess returns depend on whether the constraint is binding

stochastic dynamics

(15)

unconstrained countries:

$$\mu_R(w,t) = \sigma_R(w,t)^2 \cdot \frac{p(w,t)}{\varphi(t) + w}$$

constrained countries:

$$\mu_R(w,t) = \sigma_R(w,t)^2 \cdot \frac{p(w,t) - \overline{\theta}w}{\varphi(t)}$$
(16)

#### inelastic markets

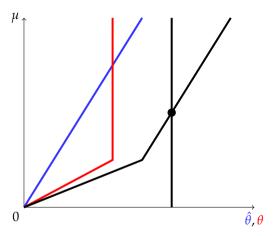


Figure: Supply is vertical. Demand  $\hat{\theta}$  from global banks in blue, from local savers  $\theta$  in red.

#### inelastic markets

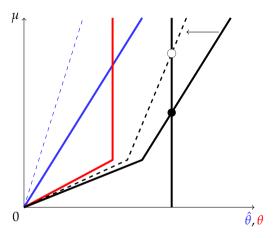


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#### elastic markets

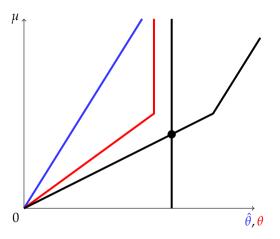


Figure: Supply is vertical. Demand  $\hat{\theta}$  from global banks in blue, from local savers  $\theta$  in red.

#### elastic markets

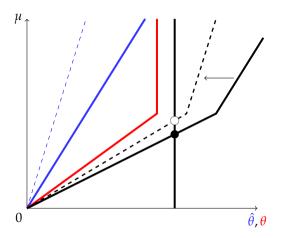


Figure: Supply is vertical. Demand  $\hat{\theta}$  from global banks in blue, from local savers  $\theta$  in red.

### adding US assets

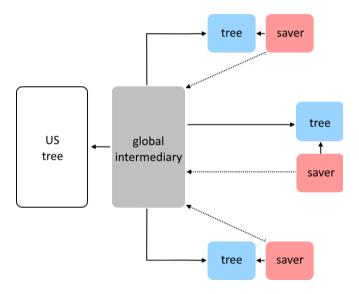
Lucas tree in the dominant country, fixed supply  $\hat{q}$ , held by intermediaries: share  $\hat{\theta}(t)$ 

Price of tree  $\hat{p}(t)$ , pays vdt:

$$d\hat{R}(t) = \frac{d\hat{p}(t) + \nu dt}{\hat{p}(t)} - r(t)dt$$
(17)

No risk in dividends, no associated ambiguity

# adding US assets



# market clearing

New market clearing conditions:

$$\hat{q} = \frac{\hat{\theta}(t)\hat{w}(t)}{\hat{p}(t)}$$

$$1 = \frac{\hat{\theta}(w,t)\hat{w}(t)}{n(w,t)} + \frac{\theta(w,t)w}{n(w,t)}$$
 for all  $w$  (19)

$$m(t) = \int_0^1 w(1 - \theta(w, t)) dG(w, t)$$

$$(1+\hat{q})\nu = \hat{c}(t) + \int_0^1 c(w,t)dG(w,t)$$
 (21)

(20)

### solving for prices

Expressions for risk premium turn into non-linear PDE for prices p(w,t)



- ▶ use definition of returns to turn equilibrium conditions into PDE for prices
- ▶ PDE has unknown coefficients  $(\mu^p, \sigma^p)$
- use Itô's lemma to characterize  $(\mu^p, \sigma^p)$  in terms of  $(\mu^w, \sigma^w)$
- use budget constraints to get  $(\mu^w, \sigma^w)$

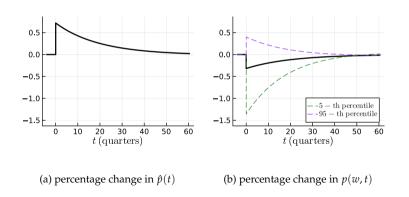
At the end: asset prices p(w,t) and wealth density g(w,t) that solved a coupled system

# shock to risk-taking capacity

# shock to $\gamma(t)$ : prices

- ▶ safe asset price  $\hat{p}(t)$  increases on impact
- ightharpoonup risky asset prices p(w,t) move in different directions





# shock to $\gamma(t)$ : holdings

Tree holdings h(w,t) defined as

$$h(w,t) = \frac{\theta(w,t)w}{p(w,t)} \tag{22}$$

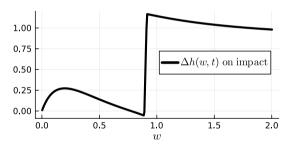
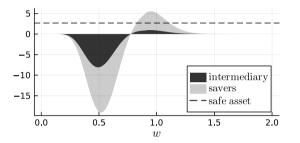


Figure: change in tree holdings on impact.

# shock to $\gamma(t)$ : loss-sharing

Figure: gains and losses on impact in percent of global GDP, weighted by density



- ▶ insurance:  $AE \rightarrow intermediary \rightarrow EM$
- ► AE and intermediary become **richer**, EM become **poorer**



# calibration and estimation

#### calibration

Calibrate steady state to reproduce aggregates, moments of assets/liabilities ratio:

	model	target	source
aggregates:			
US wealth share	31.5%	32.3%	Credit Suisse 2022
US output share	23.7%	22.8%	World Bank
average risk premium	2.62pp	2.5pp	Gourinchas Rey 2022
emerging market premium	2.22pp	2.3pp	Adler Garcia-Macia 2018
external assets to external liabilities:			
mean	1.071	1.075	IFS (IMF)
standard deviation	0.686	0.685	IFS (IMF)
q25	0.614	0.621	IFS (IMF)
q50	0.849	0.877	IFS (IMF)
$\hat{q}$ 75	1.285	1.249	IFS (IMF)

#### estimation

Estimate parameters of aggregate shocks:  $(\mu_{\gamma}, \mu_{\nu}, \sigma_{\gamma}, \sigma_{\nu})$ 

Simulate the model, compute moments of first-order deviations  $\tilde{m}(t)$  and  $\tilde{p}(t)$ 

total external assets

$$m(t) = \int w(1 - \theta(w, t))dG(w, t)$$
(23)

average risky asset price

$$p(t) = \int p(w, t)dG(w, t)$$
 (24)

#### moments

Data: quarterly returns on MSCI ex-US index for  $\tilde{p}_t$ , total outflows from IMF data for  $\tilde{m}_t$ 

Table: targets

	$\operatorname{std}(\tilde{p}_t)$	$\operatorname{std}(\tilde{m}_t)$	$\operatorname{corr}(\tilde{p}_t, \tilde{m}_t)$	$\operatorname{corr}(\tilde{p}_t, \tilde{p}_{t-1})$	$\operatorname{corr}(\tilde{m}_t, \tilde{m}_{t-1})$
data	0.048	0.049	0.738	0.785	0.828
model	0.048	0.049	0.740	0.779	0.839

estimated parameters

## untargeted moments

Associate AE to unconstrained countries

inpulse responses

Gross outflows relative to assets are more volatile in AE:

	$\operatorname{std}(\tilde{m}_t^{AE})$	$\operatorname{std}(\tilde{m}_t^{EM})$
data	0.045	0.035
model	0.074	0.027

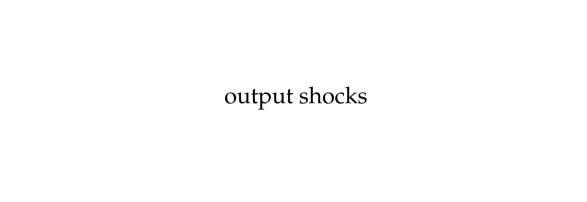
Asset prices are less volatile in AE:

	$\operatorname{std}(\tilde{p}_t^{AE})$	$\operatorname{std}(\tilde{p}_t^{EM})$
data	0.042	0.059
model	0.030	0.048

## untargeted moments: cyclicality

- ► cyclicality of outflows stronger in AE
- cyclicality of prices is stronger in EM
- ► relative performance negatively correlated with relative outflows

	$\operatorname{corr}(\tilde{m}_t^{AE} - \tilde{m}_t^{EM}, \tilde{m}_t)$	$\operatorname{corr}(\tilde{p}_t^{AE} - \tilde{p}_t^{EM}, \tilde{m}_t)$	$\operatorname{corr}(\tilde{p}_t^{AE} - \tilde{p}_t^{EM}, \tilde{m}_t^{AE} - \tilde{m}_t^{EM})$
data	0.67	-0.16	-0.17
model	0.13	-0.55	-0.59



## shock to output in ROW and US

EIS = 1: shocks to  $\gamma(t)$  do not destroy wealth, no swings in aggregate consumption:

$$\rho \int_0^1 w dG(w, t) + \hat{\rho} \hat{w}(t) = \nu(t)(1+q)$$
 (25)

Isolated shock to  $\gamma(t)$  necessarily redistributive

Data: prices go up and down together

# shocks to v(t)

Interest rate rises, all prices fall

Poor countries more exposed to foregin demand  $\hat{w}(t) \longrightarrow \text{prices fall more}$ 

Loss distribution very similar for shocks to v(t) in ROW and US



## variance decomposition

#### Financial shocks explain

- ▶ 1/4 of variance in  $m_t$
- ▶ 1/3 of variance in  $p_t^{AE} p_t^{EM}$

Table: standard deviations of first-order responses

	data	full model	only $\gamma$	only $\nu$
$m_t$	0.049	0.049	0.024	0.044
$p_t$	0.048	0.048	0.007	0.044
$p_t^{AE}$	0.042	0.030	0.009	0.033
$p_t^{EM}$	0.059	0.048	0.010	0.042
relative performance				
$p_t^{AE}$ - $p_t^{EM}$	0.035	0.026	0.019	0.010

## cyclicality of prices

Shocks to  $\gamma$  generate countercyclical returns in AE, procyclical in EM

Shocks to  $\nu$  make returns procyclical everywhere

Table: correlations of first-order responses with total outflows  $\tilde{m}_t$ 

	full model	only $\gamma$	only $ u$
$\hat{p}_t$	0.43	-0.96	0.66
${\cal P}_t^{AE}$	0.52	-0.97	0.58
${p}_t^{EM}$	0.69	0.93	0.48
$r_t$	-0.62	0.97	-0.57
relative performance			
$p_t^{AE}-p_t^{EM}$	-0.55	-0.95	-0.18

## cyclicality of wealth

Shocks to  $\gamma$  generate countercyclical wealth dynamics in AE, procyclical in EM

Table: Correlations of wealth with total outflows  $\tilde{m}_t$ 

	full model	only $\gamma$	only $\nu$
wealth			
$\hat{w}_t$	0.30	-0.95	0.11
$w_t^{AE}$	0.32	-0.89	0.97
$w_t^{EM}$	0.94	0.97	0.99

#### conclusion

Domestic demand in richer countries is more elastic due to size and portfolio constraints

- ▶ sudden stops lead to retrenchment that stabilizes prices
- assets issued by richer countries are endogenously safer
- ightharpoonup wealth transfers: rich ightharpoonup dominant ightharpoonup poor
- ► wealth redistribution: regressive



#### outflows in AE and EM

- ▶ net acquisition of foreign assets (flows):  $f_{it}$
- ightharpoonup principal component  $F_t$
- ightharpoonup total foreign assets (stock)  $A_{it}$
- ▶ position-adjusted flows:  $m_{it} = f_{it}/A_{i,t-1}$

Table: dependent variables expressed as percentage

	$m_t^{AE}$	$m_t^{EM}$	$m_t^{AE} - m_t^{EM}$
$F_t$	3.87	1.44	2.43
	(0.25)	(0.42)	(0.61)

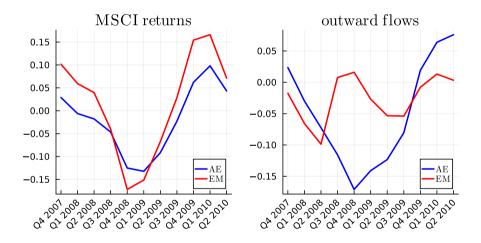
global financial crisis

taper tantrum

trade wars

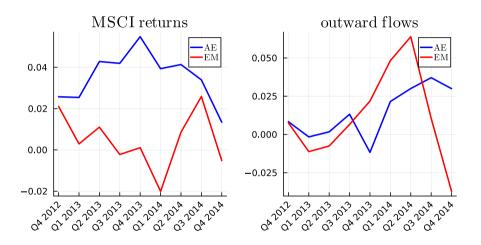
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## example: 2008



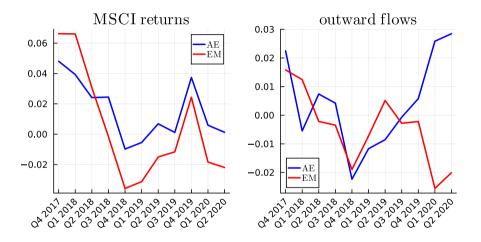


## example: 2013





## example: 2018





# 3 facts about gross capital flows

#### data

Gross outflows  $f_{it}$ : acquisition of external assets by country i in quarter t (net of sales)

▶ includes portfolio debt, equity, and bank flows

data construction

Measure of aggregate flows: principal component  $F_t$ 

Asset prices: global asset price index  $p_t$  from MSCI, quarterly returns  $Q_t = p_t/p_{t-1}$ 

# fact 1: gross flows are correlated with asset prices

Correlation of gross outflows and asset prices:

$$\operatorname{corr}(Q_t, F_t) = 0.76 \ (0.07)$$
 $N = 84$ 

# fact 2: correlation with aggregates is higher in AE

- ▶ run  $f_{it} = \alpha_i + \beta_i F_t + \epsilon_{it}$ , compute *R*-squared for every country *i*
- ▶ measure difference between AE and EM:

$$R_i^2 = r + \beta \mathbb{1}\{i \in AE\} + \epsilon_i \tag{26}$$

Table: dependent variable  $r_i$  expressed as percentage

$$8.90$$
 $(1.70)$ 
 $1\{i \in AE\}$ 
 $25.36$ 
 $(4.33)$ 
 $R^2 = 0.37, N = 67$ 

# fact 3: portfolio shifts have larger magnitudes in AE

- ▶ take **position-adjusted** outflows  $\overline{f}_{it} = f_{it}/A_{i,t-1}$
- ▶ measure difference in loadings for **position-adjusted** flows:

$$\overline{f}_{it} = \alpha_i + \gamma F_t + \beta \mathbb{1}\{i \in AE\}F_t + \epsilon_{it}$$
(27)

Table: dependent variable  $\overline{f}_{it}$  expressed as percentage

$F_t$	1.50
	(0.43)
$\mathbb{1}\{i\in AE\}F_t$	2.15
	(0.60)
$R^2 = 0.02, N =$	= 6223

alternative average overall synchronization

#### data construciton

Gross outflows  $f_{it}$ : acquisition of external assets by country i in quarter t (net of sales)

- ▶ includes portfolio debt, equity, and bank flows
- raw data  $f_{it}^{\text{raw}}$  smoothed using the procedure from Forbes and Warnock 2012, 2021:

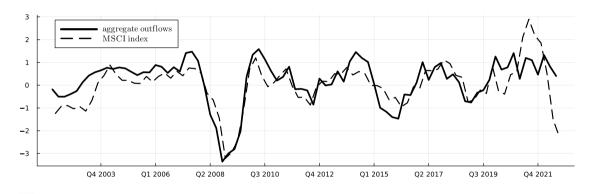
$$f_{it} = \sum_{t=3}^{t} f_{is}^{\text{raw}} - \sum_{t=7}^{t-4} f_{is}^{\text{raw}}$$
 (28)

Asset prices: global asset price index  $p_t$  from MSCI, smoothed quarterly returns  $Q_t$ :

$$Q_t = \sum_{t=3}^t \frac{p_s}{p_{s-1}} \tag{29}$$

back

# time path of outflows and prices



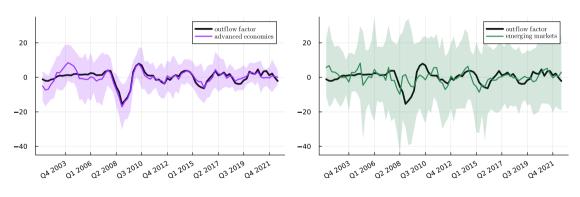


# measures of global risk-taking capacity

Table: correlations (95% confidence bands) back			
	$\overline{f}_t^{AE}$	$\overline{f}_t^{EM}$	$\overline{f}_t^{AE} - \overline{f}_t^{EM}$
principal component $F_t$	0.86	0.34	0.53
	(0.08)	(0.23)	(0.15)
VIX (negative)	0.42	0.16	0.13
	(0.19)	(0.17)	(0.15)
asset price factor, Miranda-Agrippino Rey 2020	0.27	0.03	0.15
	(0.20)	(0.11)	(0.10)
intermediary factor, <u>He et al 2017</u>	0.19	-0.17	0.26
	(0.24)	(0.21)	(0.14)
treasury basis, <u>Jiang et al 2021</u>	0.27	0.00	0.17
	(0.13)	(0.10)	(0.09)

## synchronization

Figure: average outflows  $\bar{a}_t^{AE}$  and  $\bar{a}_t^{EM}$  and outflow factor  $F_t$ 



Volatility of in-group averages: 
$$std(\bar{a}_t^{AE}) = 4.5\% \text{ vs } std(\bar{a}_t^{EM}) = 3.5\%$$

### data (averages)

Gross outflows  $f_{it}$ : acquisition of external assets by country i in quarter t (net of sales)

▶ includes portfolio debt, equity, and bank flows

data construction

Measure of aggregate flows: weighted average  $F_t$ 

• weights  $s_i = 1/\operatorname{std}(f_{it})$  for each i

$$F_t = \frac{1}{N} \sum_{i} s_i f_{it} \tag{30}$$

Asset prices: global asset price index  $p_t$  from MSCI, quarterly returns  $Q_t = p_t/p_{t-1}$ 

# fact 1: gross flows are correlated with asset prices (averages)

Correlation of gross outflows and asset prices:

$$corr(Q_t, F_t) = 0.73$$

$$(0.08)$$

$$N = 84$$
back

# fact 2: correlation with aggregates is higher in AE (averages)

- ▶ run  $f_{it} = \alpha_i + \beta_i F_t + \epsilon_{it}$ , compute *R*-squared for every country *i*
- ▶ measure difference between AE and EM:

$$R_i^2 = r + \beta \mathbb{1}\{i \in AE\} + \epsilon_i \tag{31}$$

Table: dependent variable  $r_i$  expressed as percentage

8.05
(1.55)
$$1\{i \in AE\} \quad \textbf{24.56}$$
(3.82)
$$R^2 = 0.37, N = 67$$

# fact 3: portfolio shifts have larger magnitudes in AE (averages)

- ▶ take **position-adjusted** outflows  $\overline{f}_{it} = f_{it}/A_{i,t-1}$
- ▶ measure difference in loadings for **position-adjusted** flows:

$$\overline{f}_{it} = \alpha_i + \gamma F_t + \beta \mathbb{1}\{i \in AE\}F_t + \epsilon_{it}$$
(32)

Table: dependent variable  $\overline{f}_{it}$  expressed as percentage

$$F_t$$
 1.77 (0.42)
$$\mathbb{1}\{i \in AE\}F_t$$
 **1.67** (0.69)
$$R^2 = 0.02, N = 6223$$

# intermediary's problem (ambiguity)

Consider misspecified processes  $d\hat{Z}_{it} = dZ_{it} + \xi_{it}dt$  for idiosyncratic shocks:

$$dR_{it} = (\mu_{it}^R - \xi_{it}\sigma_{it}^R)dt + \sigma_{it}^R d\hat{Z}_{it}$$

Minmax problem: first choose corrections  $\xi_{ij}$ , then portfolio and consumption

$$\max_{\{\hat{c}_t, m_t, f_t\}_{t \ge 0}} \quad \min_{\{\xi_t\}_{t \ge 0}} \mathbb{E} \int_0^\infty e^{-\hat{\rho}t} \left( \hat{\rho} \ln(\hat{c}_t) + \frac{\gamma_t}{2} \int_0^1 \xi_{it}^2 di \right) dt$$

Cost parameter  $\gamma_t$  governs risk-taking capacity:

$$\hat{ heta}_{it} = \gamma_t rac{\mu_{it}^R}{(\sigma_{it}^R)^2}$$

8/38

(33)

(34)

back

(35)

# premium for aggregate risk

Intermediaries take the following positions:

(36)

$$\hat{ heta}_{it} = \gamma_t rac{\mu_{it}^R - ilde{\sigma}_{it}^R x_t}{(\sigma_{it}^R)^2}$$

Here the aggregate risk premium  $x_t$  is

$$x_t = \frac{\gamma_t \int_0^1 \frac{\mu_{it}^R \tilde{\sigma}_{it}^R}{(\sigma_{it}^R)^2} di}{1 + \gamma_t \int_0^1 \frac{(\tilde{\sigma}_{it}^R)^2}{(\sigma_{it}^R)^2} di}$$

#### intermediaries with a VAR constraint

Issue short-term riskless liabilities  $m_t$ , invest  $(\hat{\theta}_{it})_i$  in regular country trees:

$$d\hat{w}_t = \int_0^1 \hat{\theta}_{it} \hat{w}_t (dR_{it} + r_t dt) di - m_t r_t dt - \hat{c}_t dt$$

$$\int_0^1 \hat{ heta}_{it} \hat{w}_t di = \hat{w}_t + m_t$$

$$\int_0^1 \mathbb{V}_t [\hat{\theta}_{it} (dR_{it} - \tilde{\sigma}_{it}^R \cdot dW_t)] di \leq \gamma_t \int_0^1 \mathbb{E}_t [\hat{\theta}_{it} (dR_{it} - \tilde{\sigma}_{it}^R x_t)] di$$

Net worth  $\hat{w}_t$ , consumption rate  $\hat{c}_t$ , log utility

Result: constant consumption rate 
$$\hat{c}_t = \hat{\rho}\hat{w}_t$$
 and

Result: constant consumption rate 
$$\hat{c}_t = \hat{\rho}\hat{w}_t$$
 and

$$\hat{ heta}_{it} = \gamma_t rac{\mu_{it}^R - ilde{\sigma}_{it}^R x_t}{(\sigma^R)^2}$$

(38)

(39)

(40)

## equilibrium with aggregate shocks

Given the process for excess returns

$$dR(w,S) = \mu_R(w,S)dt + \sigma_R(w,S)dZ + \tilde{\sigma}_R(w,S) \cdot dW$$
(42)

In equilibrium, excess returns satisfy

$$\mu_{R}(w,\mathcal{S}) = x(\mathcal{S}) \cdot \tilde{\sigma}_{R}(w,\mathcal{S}) +$$

$$\sigma_{R}(w,\mathcal{S})^{2} \cdot \max \left\{ \frac{p(w,\mathcal{S})(\sigma_{R}(w,\mathcal{S})^{2} + |\tilde{\sigma}_{R}(w,\mathcal{S})|^{2}) - wx(\mathcal{S}) \cdot \tilde{\sigma}_{R}(w,\mathcal{S})}{\varphi(\mathcal{S})(\sigma_{R}(w,\mathcal{S})^{2} + |\tilde{\sigma}_{R}(w,\mathcal{S})|^{2}) + w\sigma_{R}(w,\mathcal{S})^{2}}, \frac{p(w,\mathcal{S}) - \overline{\theta}w}{\varphi(\mathcal{S})} \right\}$$

$$(43)$$

Here x(S) is the aggregate risk premium

$$x(\mathcal{S}) = \frac{\gamma \int \frac{\mu_R(w, \mathcal{S})\tilde{\sigma}_R(w, \mathcal{S})}{(\sigma_R(w, \mathcal{S}))^2} dG(w, \mathcal{S})}{1 + \gamma \int \frac{|\tilde{\sigma}_R(w, \mathcal{S})|^2}{(\sigma_R(w, \mathcal{S}))^2} dG(w, \mathcal{S})}$$
(44)

## solving for prices and distributions

Shut down aggregate shocks, 
$$\sigma_{\gamma} = \sigma_{\nu} = (0,0)$$

back

(45)

(46)

Given initial conditions, prices p(w,t) and density g(w,t) solve

$$r(t)p(w,t) - \partial_t p(w,t) = y(w,t) + \mu_w(w,t)\partial_w p(w,t) + \frac{1}{2}\sigma_w(w,t)^2\partial_{ww}p(w,t)$$

$$\partial_t g(w,t) = -\partial_w [\mu_w(w,t)g(w,t)] + \frac{1}{2}\partial_{ww} [\sigma_w(w,t)^2 p(w,t)]$$

Risk-adjusted payoff y(w, t):

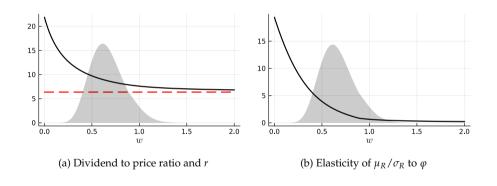
$$y(w,t) = v(t) - \left(\frac{\sigma}{1 - \epsilon(w,t)\theta(w,t)}\right)^2 \max\left\{\frac{1}{w + \varphi(t)}, \frac{1}{\varphi(t)}\left(1 - \frac{\overline{\theta}w}{p(w,t)}\right)\right\}$$

$$\left(1 - \frac{\overline{\theta}w}{p(w,t)}\right)$$

(47)

with wealth elasticity of price  $\epsilon(w,t) = w/p(w,t) \cdot \partial_w p(w,t)$ 

## steady state



back

# shock to risk-tolerance $\gamma(t)$ : quantities

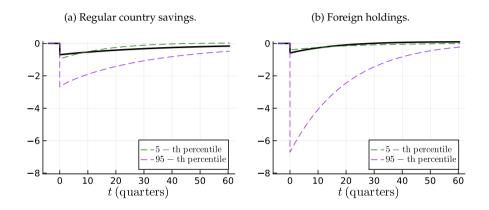


Figure: 5-th percentile of wealth distributions in green, 95-th percentile in purple.

## parameters

parameter	value	meaning
regular countries		
ho	0.0793	discount rate
$\lambda$	0.0177	emigration rate
ν	0.0600	output rate
$\sigma$	0.0647	output volatility
$\overline{ heta}$	0.7059	upper limit on risky asset share
special country		
$\hat{ ho}$	0.0844	discount rate
$\hat{\lambda}$	0.0384	emigration rate
Û	0.0600	output rate
ĝ	0.3096	asset stock
ζ	0.3824	country weight intercept
$\gamma$	0.6698	risk-taking capacity

#### estimation results

Estimate 5 parameters: persistence  $(\mu_{\gamma}, \mu_{\nu})$  and loadings  $(\sigma_{\gamma 1}, \sigma_{\gamma 2}, \sigma_{\nu 2})$ 

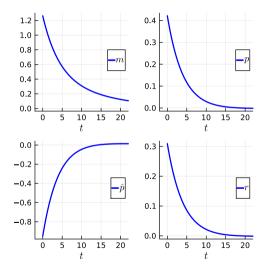
$$\begin{pmatrix} d\gamma_t \\ d\nu_t \end{pmatrix} = \begin{pmatrix} \mu_{\gamma} & 0 \\ 0 & \mu_{\nu} \end{pmatrix} \begin{pmatrix} \overline{\gamma} - \gamma_t \\ \overline{\nu} - \nu_t \end{pmatrix} dt + \begin{pmatrix} \sigma_{\gamma 1} & \sigma_{\gamma 2} \\ 0 & \sigma_{\nu 2} \end{pmatrix} \begin{pmatrix} dW_1 \\ dW_2 \end{pmatrix}$$
(48)

Results:

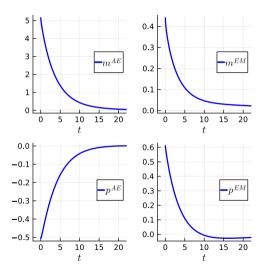
$\mu_{\gamma}$	$\mu_{ u}$	$\sigma_{\gamma 1}$	$\sigma_{\gamma 2}$	$\sigma_{ u 2}$
0.2445	0.7757	-0.1258	-0.0843	-0.0039
(0.0450)	(0.0356)	(0.0098)	(0.0056)	(0.00006)



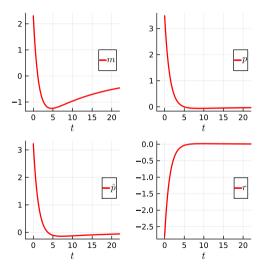
# IRF: shock to $\gamma(t)$ , aggregates



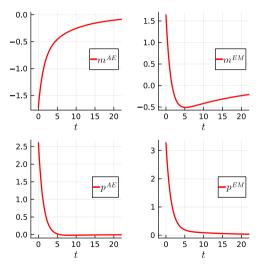
# IRF: shock to $\gamma(t)$ , AE and EM



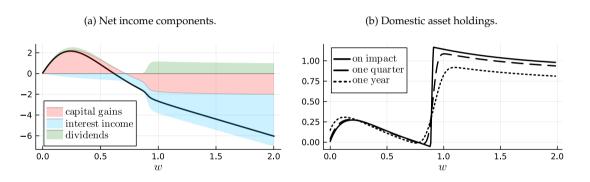
# **IRF:** shock to v(t), aggregates



# **IRF:** shock to v(t), **AE** and **EM**



## shock to $\gamma(t)$ : adjustment



► rich countries sell trees back to finance consumption and accumulate savings US adjustment back

#### **US** adjustment

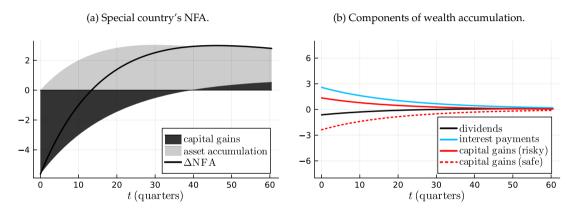


Figure: Responses of the special country's NFA and components of net income, percent of GDP.



# evidence on prices and flows

Model: relative performance of AE vs EM

- ► negatively correlated with aggregate outflows
- ▶ negatively correlated with  $\Delta = AE$  outflows EM outflows

Define  $R_t$  as returns on MSCI for AE and EM

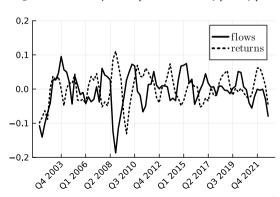
Table: pairwise correlations

	$\overline{f}_t^{AE} - \overline{f}_t^{EM}$	$R_t^{AE} - R_t^{EM}$
$F_t$	0.53	-0.28
$\overline{f}_t^{AE} - \overline{f}_t^{EM}$		-0.13

outflows

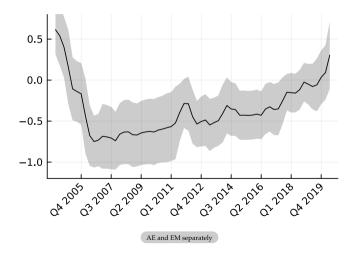
Figure: returns  $R_t^{AE} - R_t^{EM}$  and flows  $\overline{f}_{\iota}^{AE} - \overline{f}_{\iota}^{EM}$ 

AE and EM separately



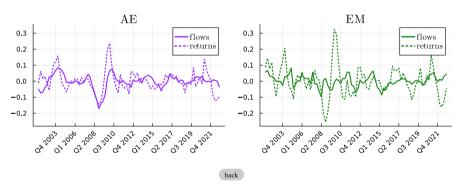
#### relative performance over time

Figure: 5-year rolling-window correlation between  $\bar{a}_t^{AE} - \bar{a}_t^{EM}$  and  $R_t^{AE} - R_t^{EM}$ 



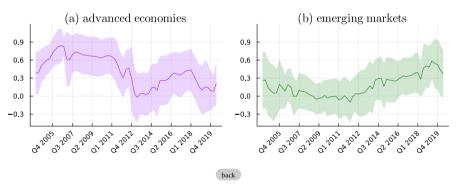
#### evidence: AE and EM separately

Figure:  $R_t^{AE}$  and  $\overline{a}_t^{AE}$  on the left,  $R_t^{EM}$  and  $\overline{a}_t^{EM}$  on the right



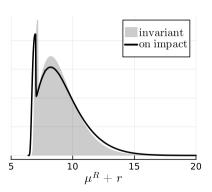
#### evidence: AE and EM separately

Figure:  $R_t^{AE}$  and  $\overline{a}_t^{AE}$  on the left,  $R_t^{EM}$  and  $\overline{a}_t^{EM}$  on the right



#### distribution of required returns

Figure: required excess returns. back



# output shocks: price responses

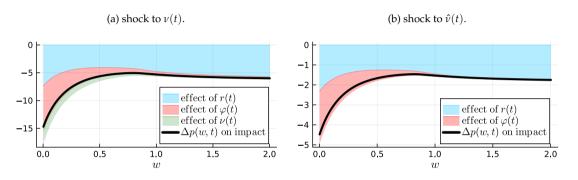


Figure: cross-section of the changes in risky asset prices on impact.

- lacktriangle interest rate rises, asset prices fall everywhere  $\rightarrow$  wealth and consumption fall
- ightharpoonup prices react to both r(t) and  $\varphi(t)$  in EM, only react to r(t) in AE



### output shocks: distribution of losses

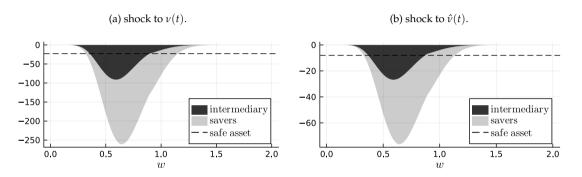


Figure: gains and losses on impact in percent of global GDP, weighted by density.

▶ loss distributions very similar for shocks of US and ROW origin

