

Who creates and who bears flow externalities in mutual funds?



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Disclaimer: The views expressed here are the authors' and do not necessarily represent the views of Deutsche Bundesbank or the Eurosystem.

Flow externality

- Remaining investors bear flow externality in open-ended funds:
 - Daily redeemability. Large outflows \Rightarrow costly portfolio adjustments (commissions, bid-ask spreads, taxes ...).
 - Portfolio adjustments spread over longer period.
- Funds with large outflows underperform in next period (e.g., [Chordia, 1996](#); [Edelen, 1999](#); [Chen et al., 2010](#)).



Who creates and who bears flow externalities?

Contribution:

- Quarterly data on dynamic sectoral ownership structure of euro area mutual funds.
- Empirical framework to measure fund-level externality **generated/received** at the investor sector level.

Main findings: actively managed equity funds, 2013Q4:2020Q2

- Total flow externality in illiquid funds: –45 bps.
- **Net externality generators:** Investment funds.
- **Net externality receivers:** Households + insurers.
- Behavioral differences across investors (procyclicality, performance-sensitivity) in line with these patterns.

Related Literature

- **Strategic complementarities and fund fragility**
Chordia (1996); Edelen (1999); Dickson et al. (2000); Chen et al. (2010); Goldstein et al. (2017); Capponi et al. (2020); Jin et al. (2021)
Coval/Stafford (2007); Chernenko/Sunderam (2020); Falato et al. (2020); Giannetti/Jotikasthira (2022)
- **Contagion in economic and financial networks**
Gai et al. (2011); Acemoglu et al. (2012); Elliott et al. (2014);
Acemoglu et al. (2015); Fricke/Wilke (2020)
- **Investment horizons and financial markets**
Miller/Rock (1985); Narayanan (1985); Stein (1989); Froot et al. (1992);
Graham et al. (2005); Timmer (2018); Giannetti/Yu (2021)

Data and Descriptives

Data

Sources

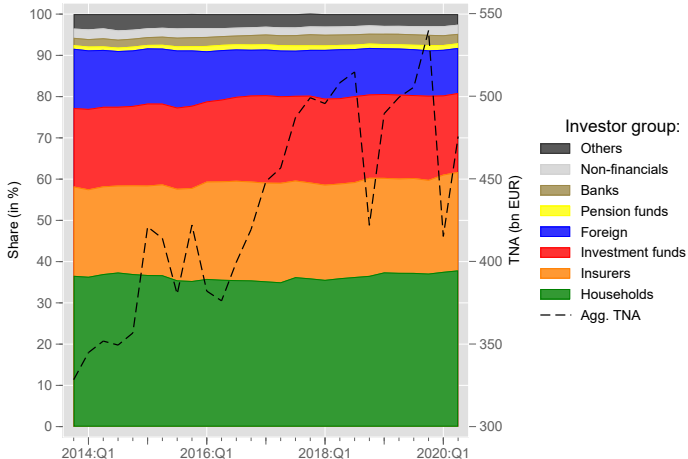
- Morningstar: fund characteristics.
- Securities Holdings Statistics by Sector: fund ownership.

Sample construction

- Actively-managed equity mutual funds
- Domiciled and available for sale in euro area
- Subject to harmonized EU regulation (UCITS)
- Predominantly held by euro area investors (residual = *Foreign*)

⇒ **Final sample:** 2013Q4:2020Q2; 7,722 share classes; 2,597 funds

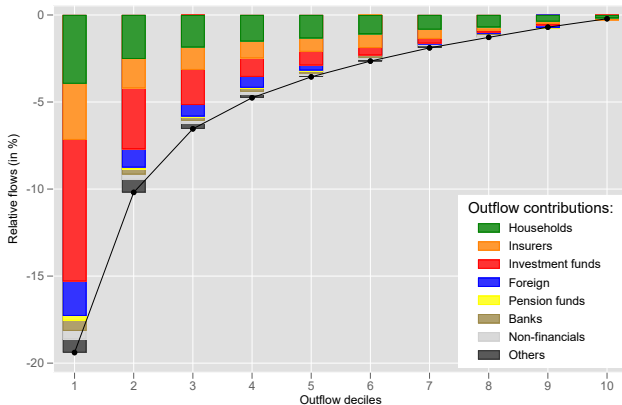
Holdings by investor sector i



Large outflow contribution by investor sector i

$$\text{EuroFlows}_{t,f,i} = \text{TNA}_{t,f,i} - \text{TNA}_{t-1,f,i} \times (1 + \text{Return}_{t,f,i}),$$

with $\sum_i \text{EuroFlows}_{t,f,i} = \text{EuroFlows}_{t,f}$.




Extreme outflows are more (less) than proportionally driven by investment funds (households and insurers) ↻

Framework

Who drives and who bears the flow externality?

- Direct measure of the total flow externality for funds with large outflows in $t - 1$:

$$\widetilde{Alpha}_{t,f} = Alpha_{t,f} - \widehat{Alpha}_{t,f}$$

with Alpha as benchmark-adjusted fund return and \widehat{Alpha} as cond. expectation given four lags of fund performance 

- Average total within-fund externality due to outflows in $t - 1$:

$$Externality = \frac{1}{n} \sum_{t,f} \widetilde{Alpha}_{t,f}$$

Decomposition by investor sector i

Externality *generated* is proportional to relative flow contribution:

$$\text{Externality}_i^{\text{generated}} = \frac{1}{n} \sum_{f,t} \left(\frac{\text{EuroFlows}_{t-1,f,i}}{\text{EuroFlows}_{t-1,f}} \right) \times \widetilde{\text{Alpha}}_{t,f}$$

Externality *received* is proportional to relative TNA share:

$$\text{Externality}_i^{\text{received}} = \frac{1}{n} \sum_{f,t} \left(\frac{\text{TNA}_{t-1,f,i}}{\text{TNA}_{t-1,f}} \right) \times \widetilde{\text{Alpha}}_{t,f}$$

$$\rightarrow \text{Net externality}_i = \text{Externality}_i^{\text{received}} - \text{Externality}_i^{\text{generated}}$$

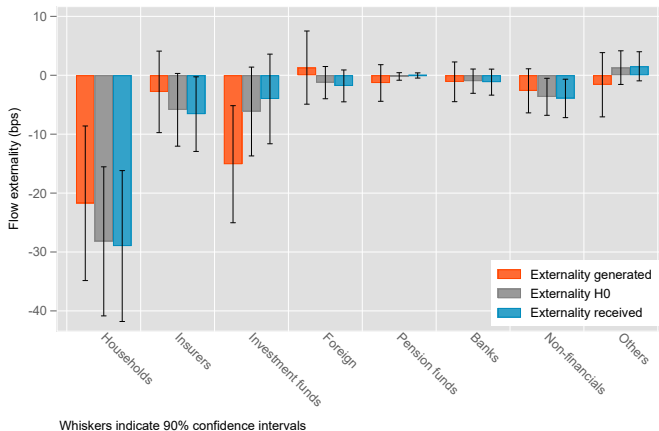
$$\text{Externality} = \sum_i \text{Externality}_i^{\text{generated}} = \sum_i \text{Externality}_i^{\text{received}}$$

$$\text{Null model: } \text{Externality}_i^{\text{H0}} = \frac{1}{n} \sum_{f,t} \left(\frac{\text{TNA}_{t-2,f,i}}{\text{TNA}_{t-2,f}} \right) \times \widetilde{\text{Alpha}}_{t,f}$$

Results

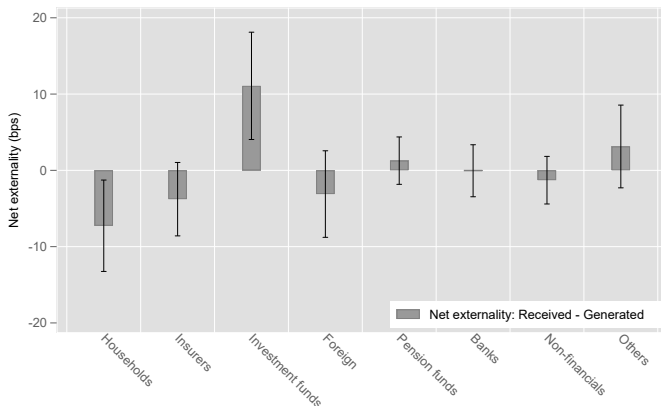
Results: Flow externality decomposition

Illiquid funds (top 25% small-/mid-cap holdings), Outflows(t-1) $\geq 10\%$:
Average total externality: -45 bps.



Results: Flow externality decomposition

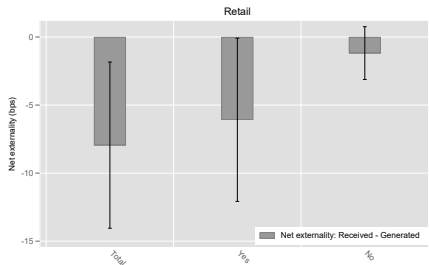
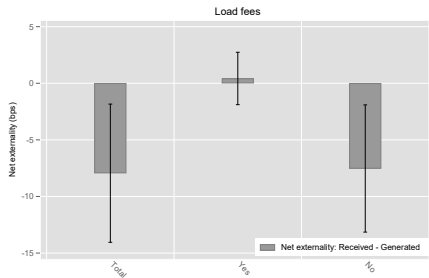
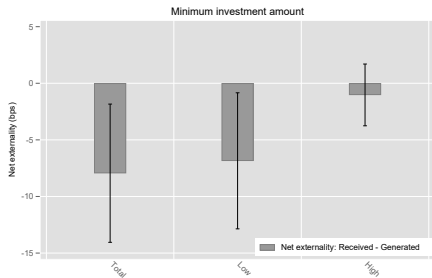
Illiquid funds (top 25% small-/mid-cap holdings), Outflows(t-1) ≥ 10%:
Average total externality: -45 bps.



Whiskers indicate 90% confidence intervals

$$\text{Net externality} = \text{Externality}_i^{\text{received}} - \text{Externality}_i^{\text{generated}}$$

Results: A closer look at households (share-class char.)



Whiskers indicate 90% confidence intervals

Additional Results/Robustness




- **Network perspective** Joint decomposition by generator/receiver confirms strong linkage from funds to households.
- **Timing** Total externality twice as large for contemp. outflows; net externality patterns similar. But: endogeneity concerns.
- **No performance reversal** Large outflows have a lasting one-off effect on fund NAVs. In line with trading-related costs.
- **Excluding COVID-19** Total externality is smaller for pre-2020 data; net externality patterns similar.
- **Different threshold** Total externality varies with Outflow-threshold. Investment funds consistently net generators.
- **Alternative performance measures** Results very similar for CAPM-Alpha.
- **Unexpected outflows** Total externality is larger for large unexpected outflows; net externality patterns similar.
- **Asymmetry** No evidence of a positive inflow externality.

Behavioral Differences Across Sectors

Lastly, we ...

- (i) regress investor sector flows on market returns and the VIX,
- (ii) estimate the flow-performance relationship investor sectors,
- (iii) take a closer look at COVID-19.

Compared to households/insurers, investment funds react stronger

- (i) to market downturns and increases in uncertainty 
- (ii) on past fund performance (also within-fund) 
- (iii) during COVID-19 

Conclusion

- Novel framework to decompose fund flow externality.
 - **Net externality generators:** Investment funds.
 - **Net externality receivers:** Households + insurers.
 - Differences due to investment funds' stronger performance sensitivity and more procyclical trading.
- Financial stability concerns: detrimental effect of short-term investors' trading activity.
- Consumer-protection concerns: retail investors bear most of the flow externality (and pay highest fund fees).
- Outlook: other fund types, liquidity management tools, between-fund externality...

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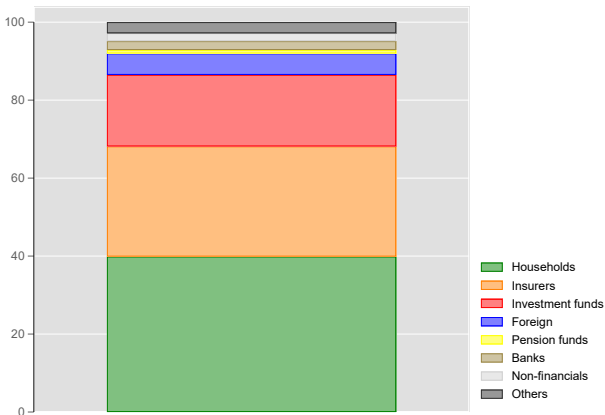
Fund characteristics by investor sector

	(1)	(2)	(3)	(4)	(5)	(6)	(7)	(8)
	Households	Insurers	Investment funds	Foreign	Pension funds	Banks	Non-financials	Others
Institutional share class	0.02	0.09 0.07*** (7.06)	0.33 0.31*** (12.59)	0.17 0.15*** (43.07)	0.51 0.49*** (36.81)	0.31 0.29*** (9.28)	0.13 0.11*** (9.09)	0.32 0.30*** (10.94)
Load fees	0.85	0.92 0.07*** (7.00)	0.75 -0.10*** (-3.95)	0.78 -0.06*** (-7.81)	0.64 -0.21*** (-6.15)	0.71 -0.14*** (-4.47)	0.79 -0.06*** (-3.46)	0.77 -0.08*** (-7.40)
log(Minimum investment)	10.87	12.92 2.05*** (12.26)	14.18 3.31*** (25.49)	14.57 3.70*** (9.05)	13.38 2.51*** (6.97)	14.14 3.28*** (18.60)	12.66 1.80*** (9.13)	13.41 2.55*** (27.97)
Expense ratio (% , p.a.)	1.64	1.53 -0.10*** (-9.97)	1.25 -0.39*** (-13.80)	1.46 -0.18*** (-19.71)	1.19 -0.45*** (-28.11)	1.43 -0.21*** (-3.63)	1.60 -0.04** (-2.42)	1.33 -0.31*** (-7.42)
log(Fund TNA)	7.98	7.42 -0.56*** (-9.07)	6.93 -1.05*** (-9.80)	7.28 -0.70*** (-7.62)	6.83 -1.15*** (-15.51)	7.53 -0.46*** (-11.82)	7.40 -0.58*** (-6.53)	7.02 -0.96*** (-9.33)
Age (years)	22.59	22.59 0.00 (-0.01)	14.46 -8.13*** (-13.26)	18.01 -4.59*** (-5.89)	14.98 -7.61*** (-8.53)	15.38 -7.22*** (-8.73)	16.40 -6.19*** (-18.74)	15.04 -7.55*** (-9.50)
Share of small/mid-cap stocks	22.49	25.93 3.44*** (9.15)	29.20 6.72*** (49.73)	30.26 7.78*** (10.90)	24.37 1.88* (1.92)	29.47 6.99*** (16.60)	30.52 8.04*** (10.02)	31.15 8.67*** (21.40)

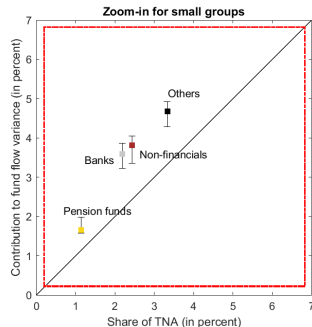
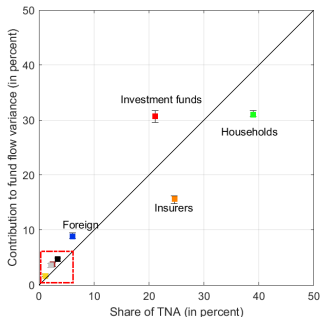
Expense ratios across different sectors

	Dependent variable: <i>Expense ratio</i>			
	(1) OLS	(2) OLS	(3) WLS	(4) WLS
Insurers	-0.089*** (-9.26)	-0.040*** (-7.90)	-0.099** (-2.30)	-0.043*** (-3.41)
Investment funds	-0.319*** (-22.56)	-0.214*** (-22.10)	-0.512*** (-11.85)	-0.271*** (-11.96)
Foreign	-0.163*** (-17.56)	-0.129*** (-15.73)	-0.306*** (-5.58)	-0.275*** (-9.94)
Pension funds	-0.509*** (-18.42)	-0.227*** (-12.70)	-0.630*** (-10.51)	-0.302*** (-7.15)
Banks	-0.088*** (-8.03)	-0.043*** (-8.01)	-0.314*** (-4.06)	-0.170*** (-5.19)
Non-financials	-0.012* (-1.95)	-0.018*** (-5.89)	-0.046 (-1.22)	-0.046*** (-3.12)
Others	-0.047*** (-5.64)	-0.040*** (-9.37)	-0.346*** (-4.03)	-0.137*** (-6.74)
Households (Constant)	1.864*** (140.28)	1.827*** (562.52)	1.696*** (59.33)	1.620*** (183.41)
R^2	0.03	0.89	0.10	0.90
Within R^2		0.08		0.17
Obs.	253,338	252,889	253,338	252,889
Fund-quarter FE	No	Yes	No	Yes

Ownership structure, conditional on outflows

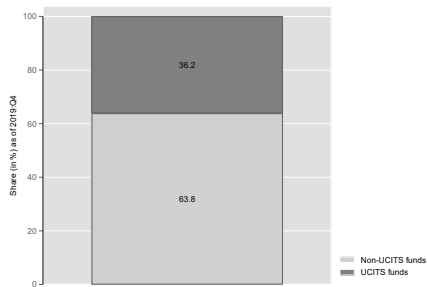
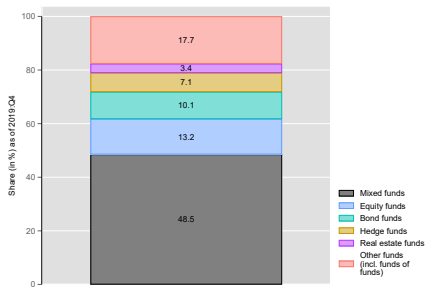


Flow variance contribution by investor sector



H0 of uniform flow behavior: flow contributions prop. to relative sector size \Rightarrow All sectors would lie on the main diagonal.

Investment funds in SHS are institutional-dominated



Total fund holdings: 2.33 trillion Euros (2019:Q4).

HH-share (non-)UCITS funds: 20% (11%).

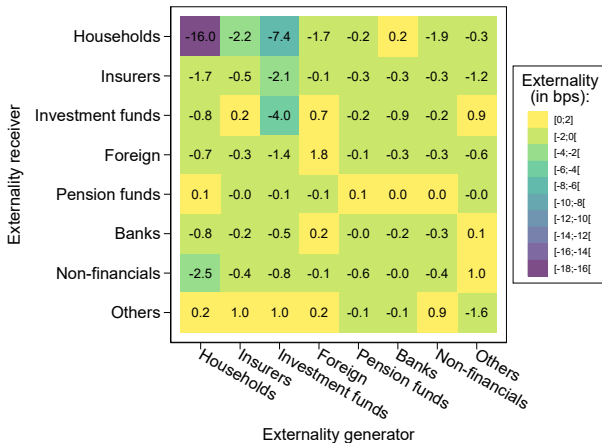
Institutional share: $64\% \times 0.89 + 36\% \times 0.8 = 86\%$.

Alpha Regression

Dep. var.: $\text{Alpha}_{t,f}$		
	(1)	(2)
Alpha_{t-1}	0.09*** (9.40)	0.09*** (8.98)
Alpha_{t-2}	0.04*** (4.65)	0.04*** (4.23)
Alpha_{t-3}	0.14*** (17.69)	0.13*** (17.07)
Alpha_{t-4}	0.01* (1.66)	0.01 (1.20)
Illiquid_{t-1}	0.00*** (3.87)	0.00*** (4.79)
$\log(\text{TNA}_{t-1})$		0.00*** (5.53)
$\text{Expense Ratio}_{t-1}$		-0.00*** (-3.98)
Constant	-0.01*** (-17.03)	-0.02*** (-9.26)
Time FEs	Yes	Yes
R^2	.1284	.1304
Obs.	29817	29817

Network view: externality from i to j

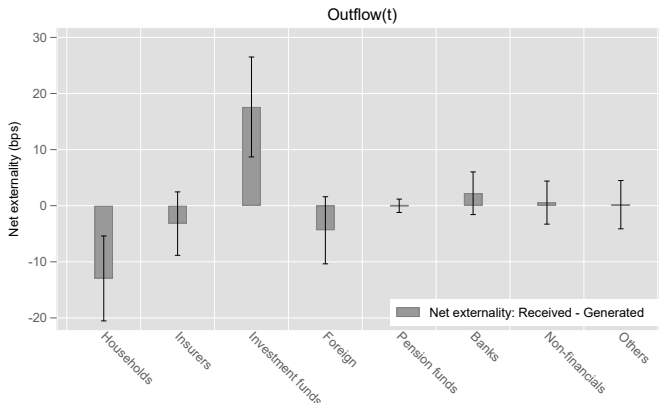
$$Externality_{i \rightarrow j} = \frac{1}{n} \sum_{f,t} \left(\frac{\text{EuroFlows}_{t-1,f,i}}{\text{EuroFlows}_{t-1,f}} \right) \times \left(\frac{\text{TNA}_{t-1,f,j}}{\text{TNA}_{t-1,f}} \right) \times \widetilde{\text{Alpha}}_{t,f}.$$



Flow externality decomposition: contemp. outflows

Illiquid funds (top 25% small-/mid-cap holdings), Outflows(t) ≥ 10%:

Average total externality: -96 bps.



$$\text{Net externality} = \text{Externality}_i^{\text{received}} - \text{Externality}_i^{\text{generated}}$$

Alpha over different forward horizons

Illiquid funds (top 25% small-/mid-cap holdings), Outflows($t-1$) $\geq 10\%$:

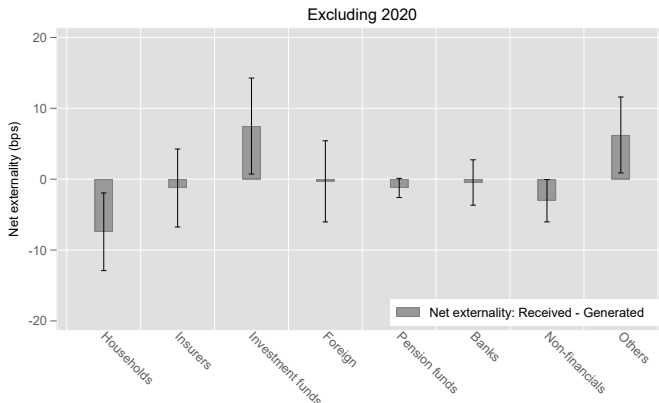
	(1)	(2)	(3)	(4)
	Dep. var.: $\text{Alpha}_{f,t+\tau}$ (in %)			
	$\tau = 0$	$\tau = 1$	$\tau = 2$	$\tau = 3$
Outflows $_{t-1}$	0.06 (0.92)	0.07 (0.98)	-0.09 (-1.31)	-0.10 (-1.32)
Outflows $_{t-1} \times$ Illiquid fund $_{t-1}$	-0.57*** (-3.27)	0.11 (0.57)	-0.05 (-0.25)	0.18 (0.81)
Illiquid fund $_{t-1}$	0.29*** (5.72)	0.31*** (5.38)	0.44*** (7.40)	0.37*** (5.59)
Alpha $_{t-1}$	0.08*** (8.76)	0.07*** (6.91)	0.15*** (19.03)	0.04*** (4.77)
Alpha $_{t-2}$	0.04*** (4.02)	0.14*** (17.66)	0.04*** (4.39)	-0.01 (-1.58)
Alpha $_{t-3}$	0.13*** (16.93)	0.04*** (4.43)	-0.01 (-0.60)	-0.06*** (-6.28)
Alpha $_{t-4}$	0.01 (1.13)	-0.03*** (-2.90)	-0.09*** (-9.51)	-0.00 (-0.14)
log(TNA $_{t-1}$)	0.07*** (5.58)	0.07*** (5.30)	0.06*** (4.60)	0.06*** (3.63)
Expense ratio $_{t-1}$	-0.12*** (-3.96)	-0.13*** (-3.99)	-0.18*** (-4.78)	-0.26*** (-6.69)
Constant	-2.33*** (-9.28)	-0.84*** (-3.07)	0.09 (0.30)	-0.28 (-0.87)
Time fixed effects	Yes	Yes	Yes	Yes
R^2	.1319	.1287	.1356	.117
Obs.	29,799	27,077	24,623	22,643

Flow externality decomposition: excluding COVID-19



Illiquid funds (top 25% small-/mid-cap holdings), Outflows(t-1) ≥ 10%:

Average total externality: -26 bps.



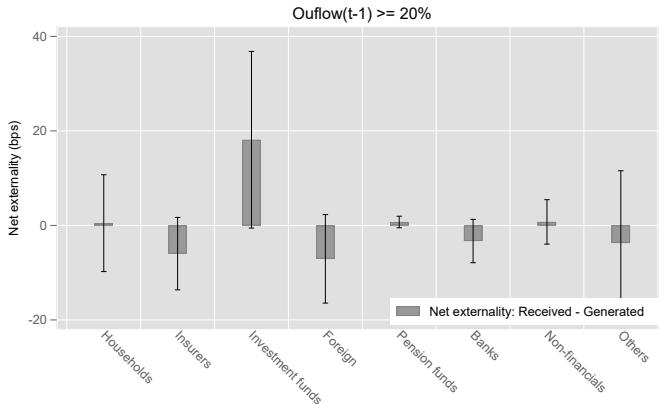
Whiskers indicate 90% confidence intervals

$$\text{Net externality} = \text{Externality}_i^{\text{received}} - \text{Externality}_i^{\text{generated}}$$

Flow externality decomposition: Higher threshold

Illiquid funds (top 25% small-/mid-cap holdings), Outflows(t-1) ≥ 20%:

Average total externality: -64 bps.



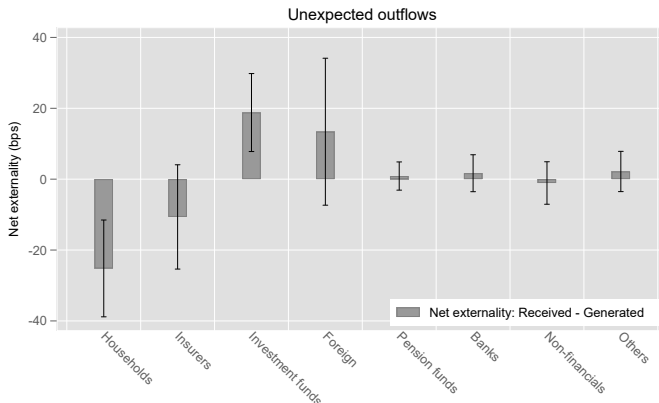
$$\text{Net externality} = \text{Externality}_i^{\text{received}} - \text{Externality}_i^{\text{generated}}$$

Flow externality decomposition: unexpected outflows



Illiquid funds (top 25% small-/mid-cap holdings), Outflows^U(t-1) ≥ 10%:

Average total externality: -54 bps.

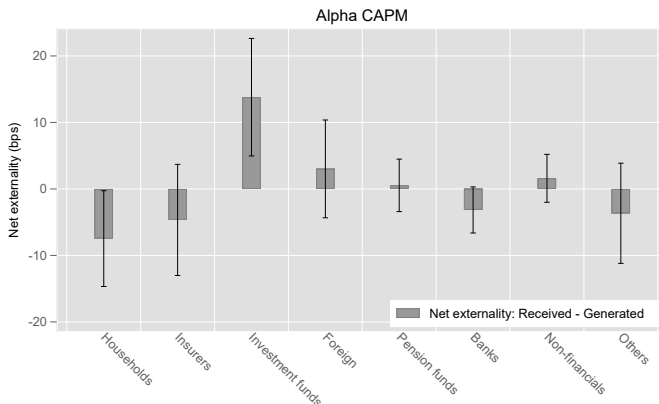


$$\text{Net externality} = \text{Externality}_i^{\text{received}} - \text{Externality}_i^{\text{generated}}$$

Flow externality decomposition: Alpha CAPM

Illiquid funds (top 25% small-/mid-cap holdings), Outflows(t-1) ≥ 10%:

Average total externality: -46 bps.



$$\text{Net externality} = \text{Externality}_i^{\text{received}} - \text{Externality}_i^{\text{generated}}$$

No positive externality from large inflows

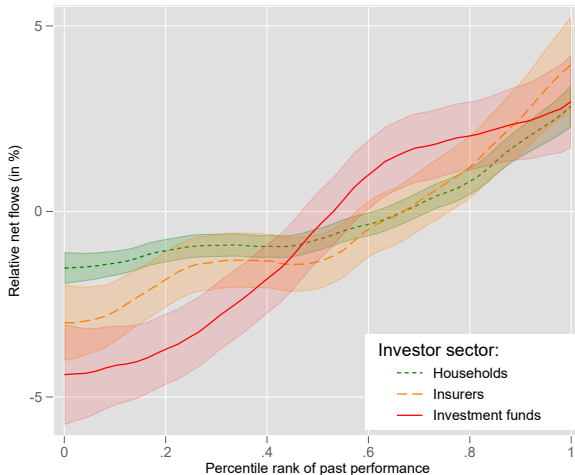
	(1)	(2)	(3)	(4)
		Dependent variable Alpha _{f,t} (in %)		
Outflows _{t-1}	-0.08 (-1.26)	0.06 (0.92)		
Outflows _{t-1} × Illiquid fund _{t-1}		-0.57*** (-3.27)		
Inflows _{t-1}			0.07 (1.09)	0.03 (0.53)
Inflows _{t-1} × Illiquid fund _{t-1}				0.10 (0.64)
Illiquid fund _{t-1}		0.29*** (5.72)		0.23*** (4.37)
Controls	Yes	Yes	Yes	Yes
Time fixed effects	Yes	Yes	Yes	Yes
R ²	.1303	.1319	.1303	.1314
Obs.	29,799	29,799	29,799	29,799

Behavioral Differences Across Sectors: Procyclicality

	(1)	(2)	(3)	(4)	(5)	(6)	(7)	(8)
	Households	Insurers	Investment funds	Foreign	Pension funds	Banks	Non-financials	Others
Panel A: Aggregate sector flows and the market								
	Dependent variable: Aggregate sector flows (in percent of previous TNA)							
Market	0.08** (2.31)	0.02 (0.89)	0.18*** (4.38)	0.03 (0.48)	0.12 (1.04)	0.20* (1.79)	0.02 (0.28)	-0.06 (-0.69)
R^2	23.0	1.1	46.4	0.7	5.1	11.7	0.1	1.1
$\Delta(j) - (1)$	-	-0.06* (-2.02)	0.10* (1.73)	-0.05 (-0.76)	0.04 (0.32)	0.11 (0.99)	-0.06 (-0.89)	-0.14 (-1.51)
Panel B: Aggregate sector flows and the VIX								
	Dependent variable: Aggregate sector flows (in percent of previous TNA)							
VIX	-0.04 (-0.49)	0.02 (0.64)	-0.16 (-1.38)	-0.01 (-0.09)	-0.33*** (-4.15)	-0.40*** (-3.36)	0.03 (0.45)	0.05 (0.41)
R^2	2.2	0.4	17.6	0.0	20.3	24.4	0.2	0.3
$\Delta(j) - (1)$	-	0.05 (0.79)	-0.12** (-2.22)	0.03 (0.39)	-0.29*** (-4.26)	-0.36*** (-5.09)	0.07 (0.83)	0.08 (0.86)

Behavioral Differences Across Sectors: FPR

$$\text{RelFlows}_{t,f,i}^b = f(\text{AlphaRank}_{t-1,f}) + b \times X_{t-1,f} + \mu_t + \epsilon_{t,f,i},$$



Outflows during the COVID-19 stress episode

