



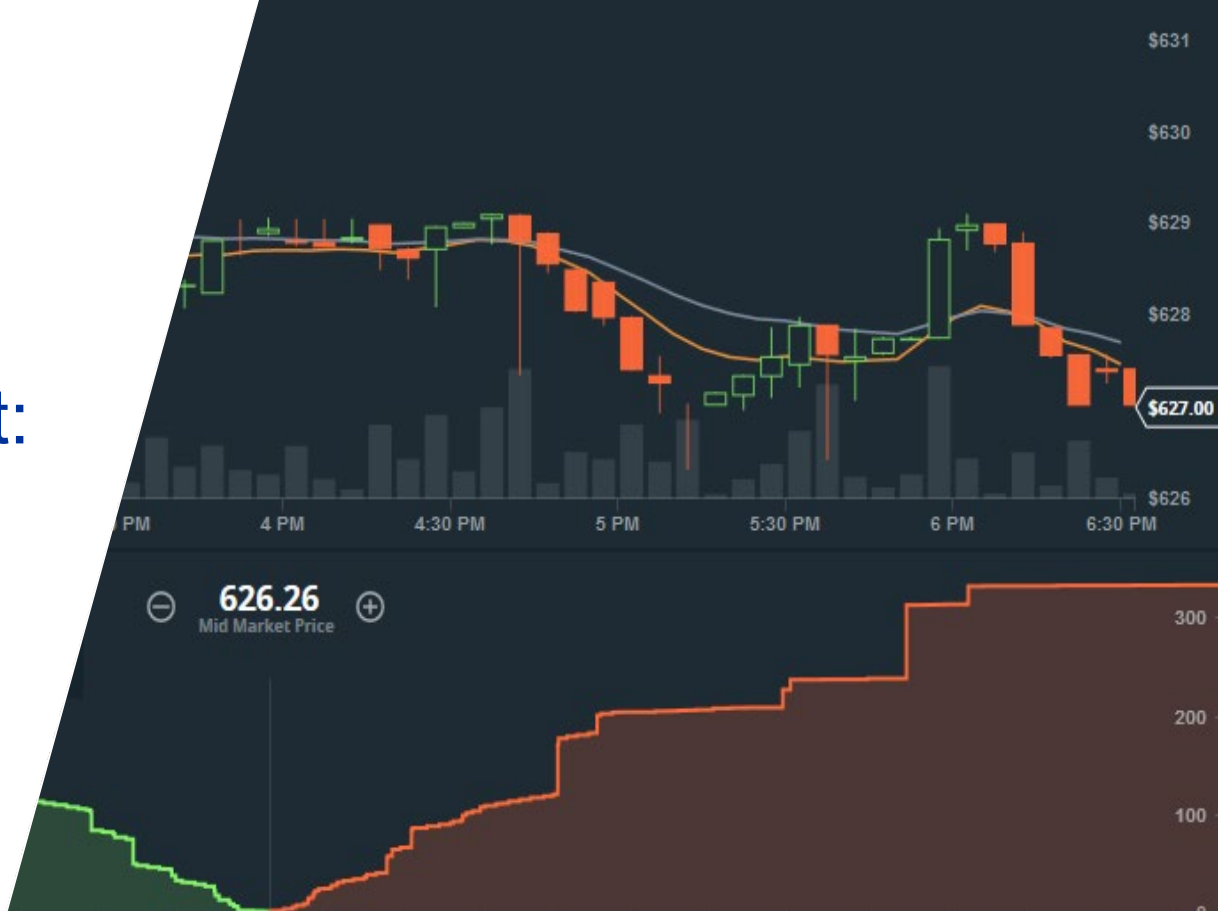
EUROPEAN CENTRAL BANK

EUROSYSTEM

# Contagion from market price impact: a price-at-risk perspective

FSB Workshop on  
systemic risks in NBFIs

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# Disclaimer

*The views expressed in this presentation are those of the authors and do not necessarily represent the views of the European Central Bank and the Eurosystem.*

# Why do we care?

- Agents' **overlapping portfolios** can provide a channel of *contagion*
- The **risk** stemming from this channel cannot be taken into account by any counterparty in the system: the regulator can capture the full picture
- In crisis situations, modelling of **asset deleveraging** requires a *notion* of **price impact – important for NBFIs**

# How to model price impact?

## Quantile regression

Expanding the standard model: calibrate a wider range of impact severities levels, while keeping the converging nature of the exponential function.

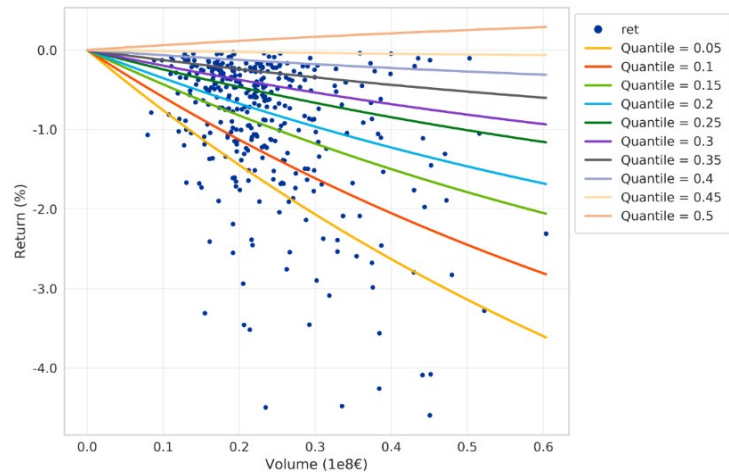
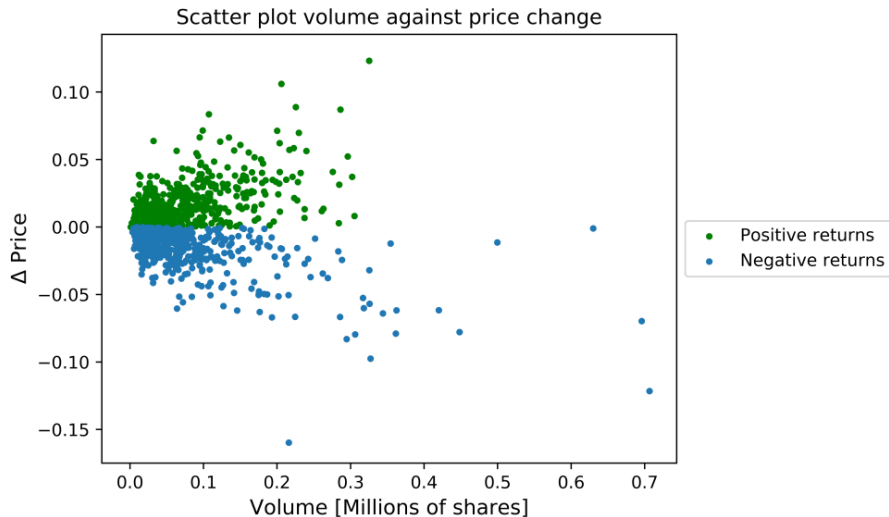
$$R(v)^q = \beta_0^q (1 - \exp(-sV)) + \beta_1^q R_{sys}$$

where  $s = \frac{\lambda}{\beta_0}$ , from which we can derive  $\lambda$ , and  $q$  is the estimated quantile.

Furthermore, a **system-level component**  $R_{sys}$  has been introduced to account for price changes due to changes in the market.

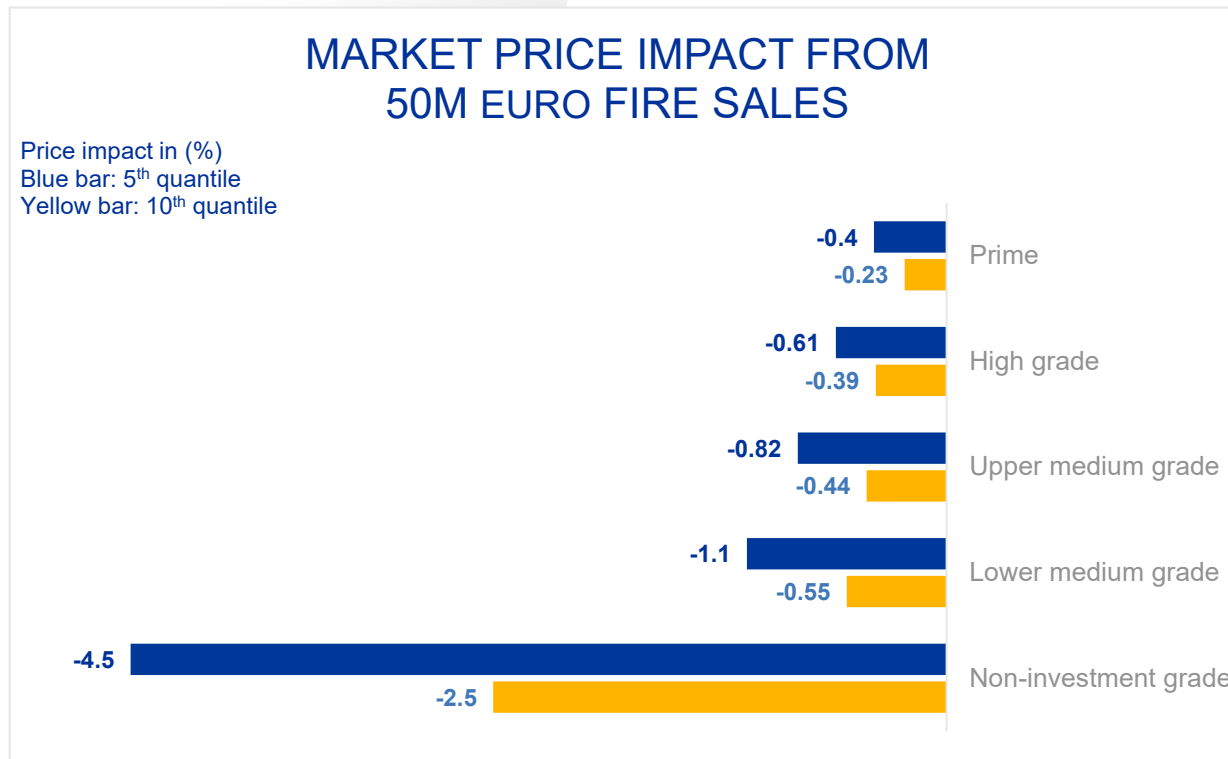
# Visualization of price calibration on empirical data

- Empirical data shows that returns diverge as volumes increase (lhs chart).
- A quantile regression approach on the negative impacts allows to evaluate risk at different intensity levels (rhs chart)



Source: Refinitive (Eikon)

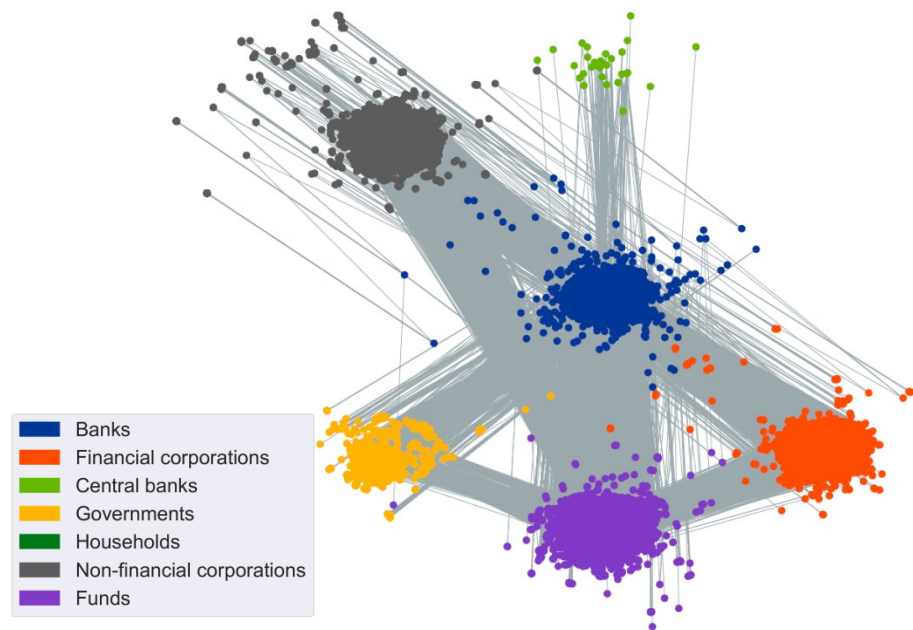
# Price-at-risk: Bond-level impact



# Fire sale simulations - Overview

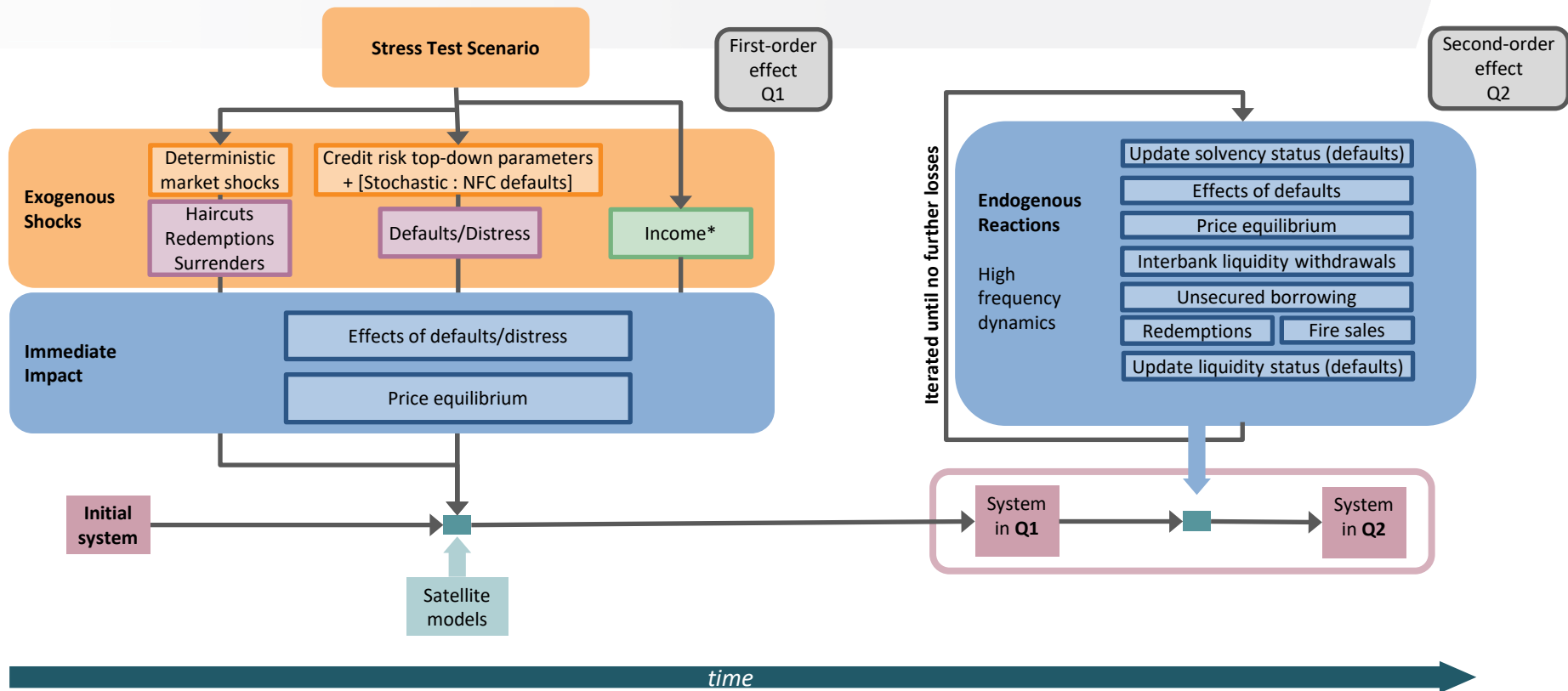
- **Using SWST model** (Sydow et al., 2021) for the system of banks and investment funds
- **Driven by liquidity shortfalls:** banks/funds cover their liquidity shortfalls by selling their tradable assets
- **Pro rata approach:** amounts sold are proportional for all securities held
- **Price equilibrium:** price impacts recalculated until no further change in market values of holdings

Securities holdings



An edge shows that a bank/fund holds assets issued by another entity in a given sector. Granular securities data are covering 7% of total bank assets.

# Fire sale simulations - Modelling framework



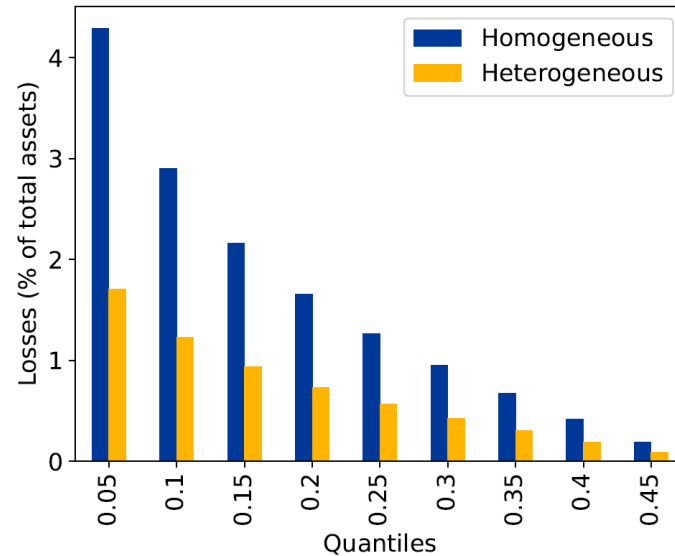
\*Income channel is, e.g., approximated from EBA 2021 ST exercise and FINREP data



# Fire sale simulations – Heterogeneity matters

- **Redemption shock** for investment funds to trigger fire sales of all securities in their portfolios
- **Banks and funds** suffer fire sale losses upon endogenous price drops
- Fire sale losses **largely depend** on the applied price impact parameters
- Heterogeneous impact parameters reveal **more limited risks** as opposed to homogeneous parameters

Comparison to homogeneous price impacts

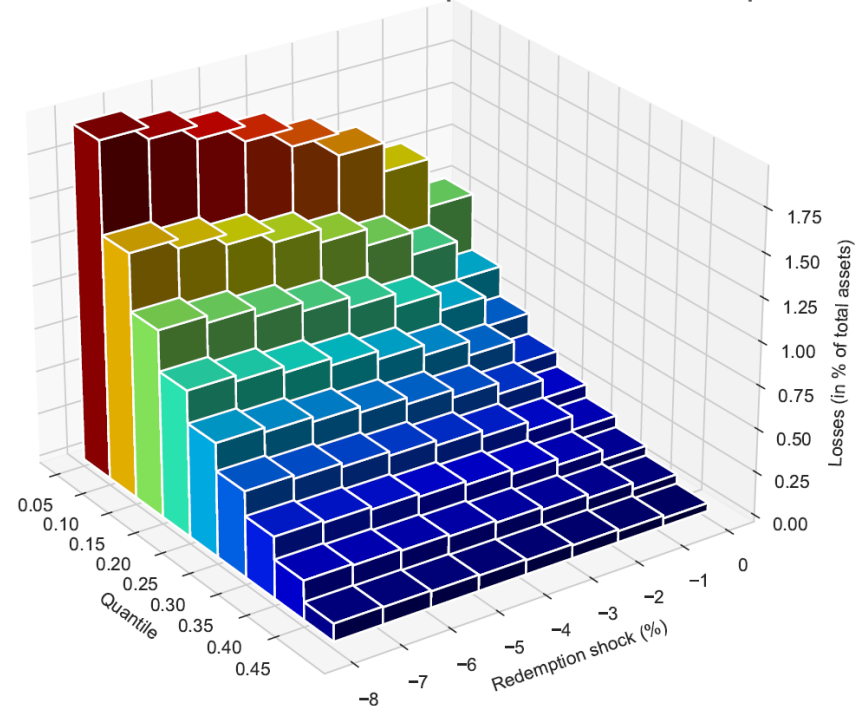


Assumed initial redemption shock for investment funds is -5%.

# Fire sale simulations – Sub-linear effects

- **Sensitivity analysis** shows a sub-linear increase in system-level losses with the increase of redemptions

Losses for different redemption shocks and quantiles



# Conclusion

- We estimated **security-level price impact** parameters for different, arbitrary amounts sold
- **Price-at-risk** is a useful complement to standard ‘average’ price impact parameters used in the literature
- Taking into account the **heterogeneity** across securities alleviates some of the risks shown by fire sale models that apply **homogenous** price impact parameters
- Historical data cannot explain the future but **former crisis episodes** can provide an **indication of the severity of future price movements** affecting the liquidity of all agents in the financial system
- Scenario-based **multi-sector stress testing frameworks**, based on granular network models, can shed light on possible pockets of vulnerability in the financial system

Thank you!

