

# Fintech Risk Management

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# FINancial TECHnologies

- Fintech denotes innovative financial services (peer to peer lending, robot advisory asset management, crypto assets,...) , enabled by disrupting technologies (big data analytics, artificial intelligence, blockchain).
- Fintech services are competitive, but may bring higher risks: credit risk; compliance risk, market risk; cyber risk, fraud detection, money laundering. All amplified by systemic risk, due to the high interconnectdness of Fintech platforms.
- Our aim is to build a risk management framework that encourages a safe digital finance, regtech and suptech.



# FIN-TECH @unipv

- We have a fintech laboratory, with 4 Faculty members and 8 Phd students, in the departments of economics and of computer engineering.
- in 2019-2020 we will be coordinating a CSA European H2020 project: FIN-TECH (FINAncial supervision and TECHnological compliance)
- The project aims to create a European platform for fintech risk management, through 3 research workshops, 6 R coding sessions and 72 hours of common lectures x 29 countries in:  
i) P2P lending; ii) robot advisory; iii) blockchain payments.



# FIN-TECH partners

| UNIVERSITIES and RESEARCH CENTRES | FINTECH HUBS and ASSOCIATIONS | REGULATORS and SUPERVISORS |
|-----------------------------------|-------------------------------|----------------------------|
|                                   |                               |                            |



# Peer to peer lending

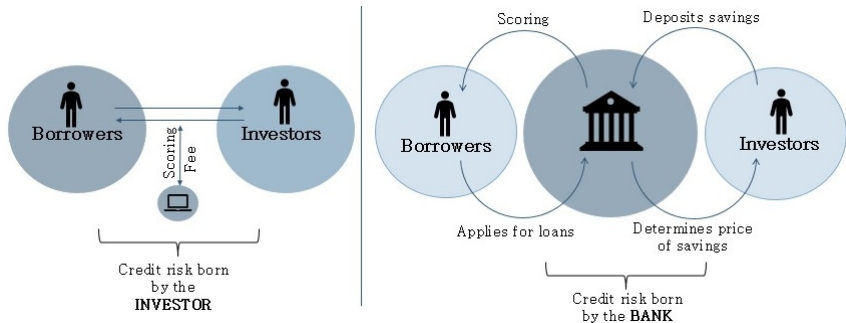


Figure: The business models of a P2P lender (left) and of a bank (right)



# Credit scoring Models

- The most employed model to estimate the probability of default is the logistic regression:

$$\ln\left(\frac{p_i}{1-p_i}\right) = \alpha + \sum_j \beta_j x_{ij},$$

from which:

$$p_i = \frac{1}{1+e^{\alpha+\sum_j \beta_j x_{ij}}},$$

a measure of idiosyncratic risk for each borrower node.



# Network-based scoring models

- We propose to extend scoring models including network centrality components:

$$\ln\left(\frac{p_i}{1-p_i}\right) = \alpha + \sum_j \beta_j x_{ij} + \gamma c_i + \lambda d_i$$

- from which:

$$p_i = \frac{1}{1 + e^{\alpha + \sum_j \beta_j x_{ij} + \gamma c_i + \lambda d_i}}$$



# The network based on the activity indicator

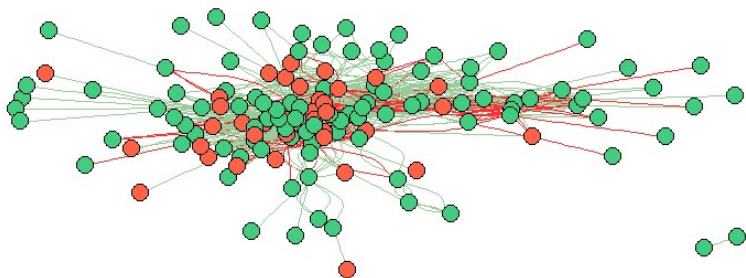


Figure: Correlation network based on the activity indicator





# Predictions: Standard Model

| Variable                                | Estimate | P-value | Significance |
|---|----------|---------|--------------|
| Intercept                               | -3.39    | 0.011   | *            |
| Solvency ratio                          | 0.01     | 0.539   |              |
| Debt to equity ratio                    | -0.07    | 0.517   |              |
| Current ratio                           | 0.21     | 0.032   | *            |
| Cash over total assets                  | -2.51    | 0.579   |              |
| Return on equity                        | -0.08    | 0.008   | **           |
| Return on assets                        | 0.01     | 0.963   |              |
| Return on Capital Employed              | 0.09     | 0.044   | *            |
| Coverage                                | -0.01    | 0.875   |              |
| Activity ratio                          | -1.92    | 0.001   | ***          |
| <b>Predictive utility (average AUC)</b> |          |         | <b>0.721</b> |

Figure: The estimated baseline regression model



## Predictions: Network based model

| Variable                                | Estimate | P-value | Significance |
|---|----------|---------|--------------|
| Intercept                               | -1.53    | 0.033   | *            |
| Solvency ratio                          | -0.02    | 0.012   | *            |
| Debt to equity ratio                    | -0.00    | 0.576   |              |
| Current ratio                           | 0.24     | 0.072   | *            |
| Cash over total assets                  | 1.08     | 0.443   |              |
| Return on equity                        | -0.11    | 0.000   | ***          |
| Return on assets                        | 0.02     | 0.876   |              |
| Return on capital employed              | 0.01     | 0.212   |              |
| Coverage                                | 0.02     | 0.248   |              |
| Activity ratio                          |          |         |              |
| Degree Centrality                       | 0.01     | 0.026   | *            |
| Closeness                               | 1.05     | 0.002   | **           |
| <b>Predictive utility (average AUC)</b> |          |         | <b>0.82</b>  |

Figure: The estimated network-based regression model



# Some recent papers on p2p risk management

- (2018) Paolo Giudici, Branka Hadji-Misheva. Scoring models for P2P platforms: a network approach. Under revision
- (2018) Daniel Ahelegbey, Paolo Giudici, Branka Hadji-Misheva. Scoring models for p2p with latent variables. Under revision
- (2017) Stefan Avdjiev, Paolo Giudici, Alessandro Spelta. Measuring contagion risk in international banking. *Journal of Financial Stability*, forthcoming
- (2017) Paolo Giudici, Peter Sarlin, Alessandro Spelta. The interconnected nature of financial systems: direct and common exposures. *Journal of Banking and Finance*.
- (2016) Paolo Giudici, Alessandro Spelta. Graphical network models for international financial flows. *Journal of Business and Economic Statistics*, 34 (1), pp. 126-138.

