

THE VALUE OF “NEW” AND “OLD”  
INTERMEDIATION IN ONLINE DEBT  
CROWDFUNDING

BY FABIO BRAGGION, ALBERTO MANCONI, AND NICOLA  
PAVANINI, AND HAIKUN ZHU

Discussion by Emiliano S. Pagnotta

Imperial College London

Nova SBE Fintech Conference, November 6, 2020

# LENDING CROWDFUNDING PLATFORMS

- Online lending started in in the mid-2000s with Zopa (UK)
- Initial business model was P2P loans—bilateral matches between lenders and borrowers— capture the portion of the market not serviced by traditional banks
- More recently, much more emphasis to marketplace model: crowdfunding platform sells loan portfolio to lenders
  - Platforms are now more bank-like
  - Lenders therein are unlike bank depositors: they face liquidity risk

# LENDING CROWDFUNDING PLATFORMS

- Online lending started in in the mid-2000s with Zopa (UK)
- Initial business model was P2P loans—bilateral matches between lenders and borrowers— capture the portion of the market not serviced by traditional banks
- More recently, much more emphasis to marketplace model: crowdfunding platform sells loan portfolio to lenders
  - Platforms are now more bank-like
  - Lenders therein are unlike bank depositors: they face liquidity risk
- Natural evolution: (1) bundling idiosyncratic risks (2) banks lacked data to understand credit risks of segments they did not serve → P2P platforms allowed those willing to take risks to facilitate credit, earning fees → simultaneously, they got access to the micro data necessary to understand credit risk of individual loans → new marketplace lending products

# LENDING CROWDFUNDING PLATFORMS

- Online lending started in in the mid-2000s with Zopa (UK)
- Initial business model was P2P loans—bilateral matches between lenders and borrowers— capture the portion of the market not serviced by traditional banks
- More recently, much more emphasis to marketplace model: crowdfunding platform sells loan portfolio to lenders
  - Platforms are now more bank-like
  - Lenders therein are unlike bank depositors: they face liquidity risk
- **Natural evolution: (1) bundling idiosyncratic risks (2) banks lacked data to understand credit risks of segments they did not serve → P2P platforms allowed those willing to take risks to facilitate credit, earning fees → simultaneously, they got access to the micro data necessary to understand credit risk of individual loans → new marketplace lending products**
- **Motivating research question:** Effect of marketplace model on welfare and credit provision
- **Ambitious empirical identification goal!**

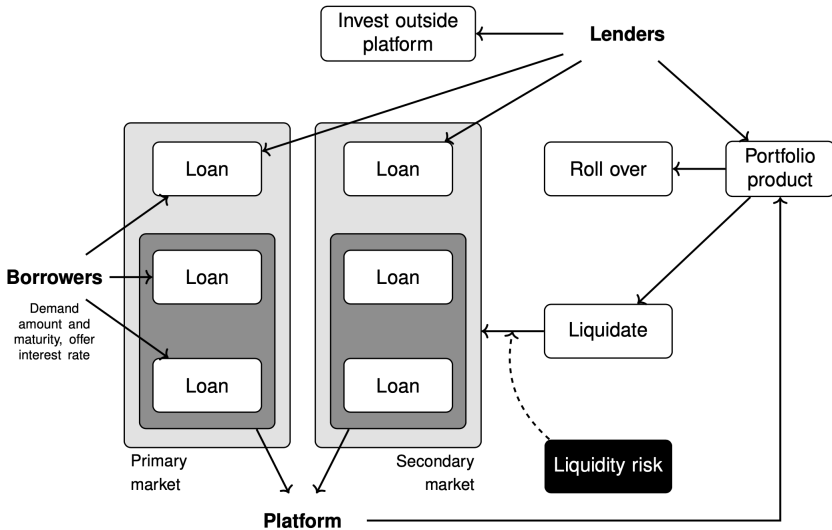
- 1** Proposes a structural model of online lending with attractive features:
  - Active platform that creates portfolio products to maximize exp. profits
  - Lenders can opt between direct loans or a variety of portfolio products; explicit liquidity risk
  - Estimation using discrete-choice econometric approach in the spirit of Berry (1994)
- 2** Exploits a uniquely granular database from [www.renrendai.com](http://www.renrendai.com), a large Chinese platform
- 3** Constructs several counterfactuals to evaluate market design impact on welfare and credit creation

- 1 Proposes a structural model of online lending with attractive features:
  - Active platform that creates portfolio products to maximize exp. profits
  - Lenders can opt between direct loans or a variety of portfolio products; explicit liquidity risk
  - Estimation using discrete-choice econometric approach in the spirit of Berry (1994)
- 2 Exploits a uniquely granular database from [www.renrendai.com](http://www.renrendai.com), a large Chinese platform
- 3 Constructs several counterfactuals to evaluate market design impact on welfare and credit creation

## ***Main finding***

- Moving to the market place model is a Pareto improvements: profits, lenders' surplus and credit supply increase
- Effects are economically significant

# ECONOMIC SETTING



Assemble portfolio products,  
choosing target return  $\mathcal{R}$   
and maturity mismatch  
with underlying loans ( $\beta^m$ )

# ESTIMATION: MARKET SHARES → LENDERS AND PLATFORM PREFERENCES

	<b>Lenders</b>	<b>Platform</b>
<b>Share of Direct Loan c</b>	<b>Share of portfolio product k</b>	<b>Weight of loan c in portfolio product k</b>
Return	Return	Return
Maturity	Maturity	Maturity
Amount	Amount	Amount
	Resale time	Default rate
		Share AA/A borrowers
		Secondary market

- Plus proportion rollover/secondary market sales



## General

- Rich equilibrium connections allow to take advantage of this granular dataset
- Impressive econometric effort; paper seems mature on that front

## Specific

- 1 Interpretation some empirical estimates
- 2 Role of competition
- 3 Role of regulation

# INSIGHTS FROM EMPIRICAL ESTIMATES

TABLE 4—LENDERS' DEMAND FOR PORTFOLIO PRODUCTS AND DIRECT LOANS

	Direct loan	Portfolio product
Log Return ( $\mathcal{R}_{kt}, r_{ct}$ )	0.30*** (0.08)	0.23* (0.13)
Log Return ( $\mathcal{R}_{kt}, r_{ct}$ ) $\times$ Active lenders %	2.94** (0.12)	2.31* (0.11)
Log Maturity ( $\mathcal{M}_{kt}, m_{ct}$ )	0.27*** (0.02)	0.01 (0.03)
Log Maturity ( $\mathcal{M}_{kt}, m_{ct}$ ) $\times$ Active lenders %	0.22 (0.23)	-0.59** (0.25)
Log Amount ( $\mathcal{A}_{kt}, a_{ct}$ )	0.52*** (0.01)	0.99*** (0.03)
Log Amount ( $\mathcal{A}_{kt}, a_{ct}$ ) $\times$ Active lenders %	0.11 (0.17)	0.24 (0.27)
Resale Time ( $\sigma_{kt}$ )		-5.41*** (2.08)
Resale Time ( $\sigma_{kt}$ ) $\times$ Active lenders %		53.72* (32.22)

- **Returns.** (+) coefficient on return, seems intuitive. But what is our prior hypothesis? What is the risk-return benchmark? Are lenders subject to behavioral biases?
- Do lenders have access to any risk metric? If not, controlling for maturity, why would they invest in low return products?
- If for diversification reasons, should we incorporate that feature to the otherwise single product choice setting?

TABLE 6—PLATFORM'S DEMAND FOR DIRECT LOANS

	Mean	Standard Deviation
Return ( $r_{ct}$ )	-0.38	1.62
Maturity ( $m_{ct}$ )	0.11	0.53
Amount ( $a_{ct}$ )	0.97*** (0.08)	
Default rate borrowers ( $d_{ct}$ )	-0.52*** (0.08)	
Share AA/A borrowers	4.45*** (0.41)	
Secondary market loan category	-2.70*** (0.09)	

- **Returns.** (-) If signaling effects are at play, it'd be interesting to give borrowers a more explicit role
- Borrowers' return posting makes pricing different from classical IO where consumers act as price takers

# ROLE OF COMPETITION

- Analysis is based on the 5th largest platform in China (5%) market share
- As of 2015 there were 2,590 P2P platforms in China; 1,021 in 2018 (p2pmarketdata.com)
- **Lender segmentation.** How segmented are lenders across these platforms?
  - If access to multiple platforms is relatively easy, comparing shares from a single platform could challenge the identification of lender's preferences
- **Product differentiation**
  - How much product differentiation among top platforms? Vertical/horizontal?
  - Do other platforms offer more appealing P2P terms?
  - Could entry be related to the finding that different investors arrive over time to Renrendai? ("more focused on diversification and limiting risk than on yields") Other preference shocks?

# ROLE OF REGULATIONS

- The paper addresses a counterfactual in which the platform bears liquidity risk (bank-like model)
- Authors write that such a comparison can “contribute to the ongoing regulatory debate on debt crowdfunding”
- Exciting opportunity to push the model to provide more specific insights
- Bring banks into lenders' choice set
  - What type of imperfect competition outcome do we obtain? Refine outside options over time (perhaps abstracting from P2P choice)
  - Bank/lending platform competition can help estimating the shadow price of bank regulations
  - Can help estimate regulations' welfare effect. Is it optimal to bring uniform regulations for all lenders?

# CONCLUSIONS

- Ambitious and interesting paper exploiting state of the art methods and unique micro data
- Raises many interesting questions, scope for more work in this area
- Opportunity to build on econometric framework to study optimal regulations of fintech firms

