

# What drives the expansion of the peer-to-peer lending?

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Discussion by Sara Biancini

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- ▶ Very young industry, mainly post 2007 financial crisis... difficult and challenging to predict the evolution of the sector.
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- ▶ Data from the US platforms Lending Club and Prosper (2006-2013).
- ▶ Matched with county-level industry and socio-economic characteristics (+ innovation).

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- ▶ Empirical strategy: based on the hypothesis of spatial correlation. Tested?
- ▶ Alternative models inspired by the innovation literature: logistic diffusion models...
- ▶ The autoregressive term is strongly significant. But, do the other explanatory variable have high time variation? If not, risk to capture something else?
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## Competition variables:

- ▶ C3 and branches per capita significant and negative (HHI never significant). Interpreted as consumer loyalty (switching costs).
- ▶ Alternative explanation: small markets (high costs/risks foreconomic, historical reason) are associated with both high concentration/low development of P2P lending.
- ▶ It could be interesting to have an “entry model” (explain how P2P lending appears in a County), also because of possibly many zeros in the dependent variable. Some two-stages procedure ?

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- ▶ Identified only by geographical heterogeneity, because almost all the sample is during/after the financial crisis.
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