# The Geography of Mortgage Lending in Times of FinTech. 

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# Outline 

0. Topic and Setup
1. Market Concentration
2. Risk Management
3. Automation
4. Conclusion

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## 0. Topic and Setup

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## A Web Platform for Mortgage Lending without Branches

- Study bank lending decisions on Swiss Web Platform Comparis
- In 2008-13 households could apply for mortgages, specifying household finances, object intended to buy, amount, fixation period
- Then got responses from several banks (including those with no branches there):
- Offer vs. Rejection
- Conditional on Offering, the Price
- Analyze these 2 dimensions to infer how this depends on, and affects:

1. Competition
2. Banks' Risk Management / Portfolio Diversification
3. Automation and thereby operational costs

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## 1. Market Concentration

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Hypothesis 1: Lower Prices to More Concentrated Markets

- In basic oligopolistic version of Monti-Klein model of banking (see Freixas and Rochet, 2008) banks optimize lending \& deposit businesses separately, for 1 period
- More realistically, clients have switching costs (Beggs and Klemperer, 1992; Sharpe, 1990; von Thadden, 2004; Freixas\&Rochet, 2008) $\rightarrow$ clients get package for $>1$ period
- Then follow-on business more lucrative in less competitive local markets

Hypothesis 1: Expect Higher offer propensities, and lower margin offers, the more concentrated (sic) the local mortgage market is so far.

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## Methodology 1: Instrument for Market Concentration

- Unobservable regional attractiveness could bias relation between prior concentration and current offer behaviour
- Response: Instrument concentration (HHI for mortgage growth in 2010) with 2009 market shares of "Swiss Big Two" UBS and CS from SNB website
- Both suffered severe losses in US subprime crisis in 2007-8
- Irritated Swiss households withdrew many deposits
- So Big Two had to cut new lending
- In cantons where Big 2 bigger, this reduced market concentration more ...


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## Results 1 on Market Concentration

|  | (1) | (2) | (3) | (4) | (5) | (6) |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: |
|  | Offer | Price | Offer | Price | Offer | Price |
| HHI | $0.78{ }^{* * *}$ | -0.54*** | 1.20 ** | $-0.57^{* * *}$ | $1.51^{* * *}$ | -0.50 *** |
| I(LTV $\geq 67 \%$ ) | -0.05* | 0.05*** | -0.05* | 0.05*** |  |  |
| I(LTV $\geq 80 \%$ ) | -0.85*** | $0.03{ }^{* * *}$ | -0.86*** | $0.03^{* * *}$ |  |  |
| I(LTI ${ }^{\text {a }}$.5) | -0.18*** | 0.00 | -0.18*** | 0.00 |  |  |
| $1(L T I \geq 5.5)$ | -0.85*** | $0.03{ }^{* * *}$ | -0.86*** | 0.03*** |  |  |
| I(New Mortg.=1) | 0.10*** | 0.02*** | 0.10*** | $0.02^{* * *}$ |  |  |
| House price growth | -1.40* | 0.09 | -0.92 | -0.05 |  |  |
| Number of Web |  |  |  |  |  |  |
| Providers | $0.02^{* *}$ | -0.01*** | 0.02*** | $-0.01^{* *}$ |  |  |
| Ln(Total Assets) | $0.06{ }^{* * *}$ | -0.05*** |  |  |  |  |
| Mortgages/TA | $0.02^{* * *}$ | -0.00*** |  |  |  |  |
| Deposits/TA | -0.02*** | 0.00 *** |  |  |  |  |
| Equity/TA | $0.04{ }^{* *}$ | 0.02*** |  |  |  |  |
| Constant | -0.46* | 1.67*** | 0.67** | 1.20 *** |  | $1.02^{* * *}$ |
| d(Offer)/d(HHI) | $0.18 * *$ |  | 0.28*** |  | 0.35*** |  |
| Observations | 25,125 | 20,583 | 25,113 | 20,583 | 24,428 | 20,583 |
| Estimation | IV Probit | IV | IV Probit | IV | $\begin{aligned} & \text { 2SRI } \\ & \text { Logit } \end{aligned}$ | IV |
| Bank FE | No | No | Yes | Yes | Yes | Yes |
| Year*Month FE | Yes | Yes | Yes | Yes | No | No |
| HH Group FE | No | No | No | No | Yes | Yes |

2 outcomes, 3 specifications...
Confirm H1: 0.1 unit rise in HHI (US DoJ distinction of high vs. low concentration) raises offer propensities by 2-3\% and cuts prices by 5bps

More pronounced for young, firsttime borrowers and amounts $>1$ mio

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## 2. Risk Management

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## Hypothesis 2 on Geographical Diversification

- Pro diversification: Portfolio theory says can lower bank risk by adding assets whose returns are imperfectly correlated with those of existing portfolio; Empirical evidence e.g.:
- Goetz-Laeven-Levine (JFE, 2016): Banks more (deposit-)diversified have less volatile stock prices
- Quigly \& Van Order (JPubEc, 1991): Mortgage portfolios riskier if less regionally diversified
- Con 1: Concentration may allow better screening (e.g. Loutskina \& Strahan, RFS 2011)
- Con 2: Also allows internalizing liquidation externalities (Favara \& Giannetti, JF 2017)
- But analyze standardized market where collateral value estimated with same hedonic model for entire country anyway, hence posit:


## Hypothesis 2: Higher offer propensity and lower margin offers when

unemployment rates (hence PDs) or house prices changes (hence LGDs) in client canton less correlated with those in bank's canton.

## Methodology 2: Exploit unique N*N Setup

- Regressions on Market Concentration HHI could use only HH Group FE (defined by LTV*LTI*New*Year*Month) due to collinearity with HHI
- But now can include both lender and borrower fixed effects
- Fairly unique to see responses from different lenders to each household...
- So may interpret correlations as exogenous and need no instrument


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## Results 2 on Risk Management

|  | (1) | (2) | (3) | (4) | (5) | (6) |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: |
|  | Offer | Price | Offer | Price | Offer | Price |
| Unemp. Compl. | 1.36*** | $-0.33^{* * *}$ | $0.64 * *$ | $-0.24{ }^{* * *}$ | $2.41^{* * *}$ | $-0.25^{* * *}$ |
| HHI | 0.17 | -0.39*** | 0.49* | -0.43*** |  |  |
| I(LTV $\geq 67 \%$ ) | -0.05* | 0.05*** | -0.05* | $0.05^{* * *}$ |  |  |
| I(LTV $\geq 80 \%$ ) | $-0.84{ }^{* * *}$ | 0.02*** | -0.85*** | 0.03 *** |  |  |
|  | -0.18*** | -0.00 | $-0.17^{* * *}$ | 0.00 |  |  |
| $1(L T I \geq 5.5)$ | -0.86*** | 0.03*** | -0.86*** | 0.03*** |  |  |
| I(New Mortg.=1) | 0.09*** | $0.02^{* *}$ | 0.09*** | 0.02*** |  |  |
| Ln(Total Assets) | 0.03** | -0.04*** |  |  |  |  |
| Mortgages/TA | 0.02 *** | -0.00*** |  |  |  |  |
| Deposits/TA | -0.01*** | 0.00* |  |  |  |  |
| Equity/TA | $0.07^{* * *}$ | 0.01*** |  |  |  |  |
| Constant | 0.90*** | $1.31^{* * *}$ | 1.67*** | 0.85*** |  | $0.72^{* * *}$ |
| d(Offer)/d(Compl.) | $0.32^{* * *}$ |  | $0.15 * * *$ |  | 0.10 * |  |
| Observations | 25,060 | 20,533 | 25,048 | 20,533 | 9,689 | 20,533 |
| Estimation | Probit | OLS | Probit | OLS | Logit | OLS |
| Bank FE | No | No | Yes | Yes | Yes | Yes |
| Year*Month FE | Yes | Yes | Yes | Yes | No | No |
| HH FE ${ }_{12.11 .2020}$ | No | No | No | No | Yes | Yes |

## Confirm H2:

1SD (0.07 units) rise in complementarity increases $\operatorname{Pr}($ Offer ) by about 2\% and cuts prices by about 2bps.

Similar results for house price complementarity.

Diversifying via web lending can be alternative to securitization or bank holding companies.

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## 3. Automation

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## Hypothesis 3 on Automation

- Following Cerqueiro et al (2011), can use Harvey (1976) model of multiplicative heteroscedasticity to analyze how much bank decisions deviate from rules
- Estimate (bank-specific) rules, then relate squared deviations to correlates of interest

Hypothesis 3: Expect more automation for offers ...
(a) ... to safer applicants: Lower LTV, lower LTI, more standard collateral.
(b) ... from banks which are larger or more mortgage-specialized.
(c) ... submitted by banks with more web experience.

## Strategy 3 on Automation

- Following Harvey (1976) and Cerqueiro et al (2011), we estimate:
- Mean Equation: "rule" for offer and pricing decisions
- Variance Equation: relate log of squared residuals ("discretion") to regressors
$\ln \left(u_{h, b}^{2}\right)=\alpha+\beta X_{h}+\gamma X_{b}+\delta\left(H_{H}\right)+\theta\left(\right.$ Complementarity $\left._{h, b}\right)+\mu\left(\right.$ Experience $\left._{h, b}\right)+\varepsilon_{h, b}$

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## Results 3 on Automation

|  |  |  |  |
| :--- | :---: | :---: | :---: | :---: | :---: | :---: |

Confirm H3: More automation for:

- Safer borrowers
- Bigger / more mortgage -focused lenders
- Each 1'000 responses sent out
$\sqrt{ } 0.11=0.33 \%$ less offer and $\sqrt{ } 0.08=0.28 \%$ less pricing discretion

Results shown here use one rule, but robust to bank-specific rules...

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## 4. Conclusion

## Conclusion

- FinTech web platforms match banks with borrowers they would not meet else
- With unique data, show how this changes lending behaviour
- Key findings:

1. Borrowers benefit from more offers and lower prices
2. Banks improve regional diversification of mortgage portfolio
3. Business more automated (more efficient) for larger banks and safer clients

- NB: The net benefits of these changes are likely to vary by setup
- We deem them positive in our setup of standardized lending with good hard info, but they could be less positive the more soft information continues to matter...

