Can Everyone Tap into the Housing Piggy Bank? Racial Disparities in Access to Home Equity

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Fed disclaimer (co-authors) \rightarrow They do not speak for:

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• Raphael Bostic, President Atlanta Fed



• Patrick T. Harker, President Philly Fed

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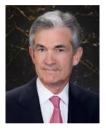
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 Jerome Powell, Chairman of Federal Reserve

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My disclaimer \rightarrow I also don't speak for my boss:

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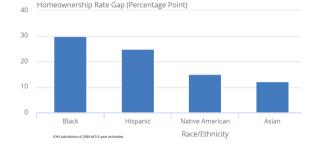


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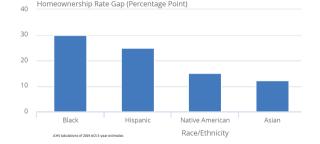
• Large minority-White gaps in homeownership rates



• A lot of attention (policy/research) on closing ownership gaps, because...

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• Large minority-White gaps in homeownership rates



- A lot of attention (policy/research) on closing ownership gaps, because...
- Home equity is an important source of wealth for U.S. households

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Disparities in Access to Home Equity

• Home equity used for (to list a few):

- Consumption smoothing
- Finance home improvements
- Finance education
- Finance small businesses
- Downpayment for home purchase by children

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 - Reverse mortgage (only for people over 62)

- Consumption smoothing
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- But, not trivial to access home equity!
- Three main ways:
 - Sell house (high transaction costs)
 - Reverse mortgage (only for people over 62)
 - **OMORTHANGE EQUITY WITHOR WEAK (MEW) Products (e.g., HELOC)**

- How difficult is it for homeowners to access their home equity via MEW products?
 - Cash-out refinances
 - Home equity lines of credit (HELOCs)
 - Closed-end home equity loans (HELoans)

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 - Cash-out refinances
 - Home equity lines of credit (HELOCs)
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- Racial disparities in access to MEW products?
- What explains racial disparities?
 - Underwriting factors?
 - Discrimination?

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 - Cash-out refinances
 - Home equity lines of credit (HELOCs)
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- Racial disparities in access to MEW products?
- What explains racial disparities?
 - Underwriting factors?
 - Discrimination?
 - ${\scriptstyle \bullet}$ Under-explored area \rightarrow dearth of data before cHMDA 2018+

- MEW rejection rates are substantially higher than purchase and rate-term refinance rates.
 - 26% vs. 10%

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 - Credit scores and DTI ratios are the most important factors.
 - Lender FEs also important.

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- "Residual" disparities non-trivial \Rightarrow 3–4 ppts.

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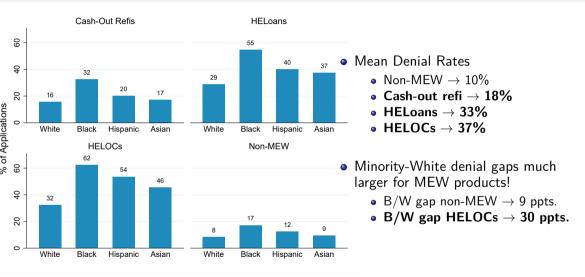
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 - Credit scores and DTI ratios are the most important factors.
 - Lender FEs also important.
- "Residual" disparities non-trivial \Rightarrow 3–4 ppts.
- Unobserved underwriting factors unlikely to be sole driver of "residual" disparities (discrimination?)

Data and Sample Construction

- Confidential HMDA data in 2018–2021 period.
 - Additional loan and borrower characteristics added to HMDA reporting requirements in 2018.
 - DTI and LTV ratios.
 - Credit score (confidential files only)
 - HMDA coverage expanded to include HELOCs in 2018.
 - Exemption for institutions with fewer than 500 originations.
- MEW products (HELOCs, HELoans, cash-out refis)
 - Asian, Black, Hispanic, and White applicants.
 - \sim 16 million applications across all 50 states.

Summary Statistics

Application denial rates (and racial gaps) much higher on MEW



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Back-of-the-Envelope Calculations – over our sample period (under some assumptions)

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| (in billions) | White | Black | Hispanic | Asian |
|-------------------------------|---------|----------|----------|--------|
| Applied to extract | \$599.1 | \$46.4 | \$68.4 | \$89.2 |
| Denied | \$159.0 | \$23.0 | \$26.2 | \$32.9 |
| Unconditional "excess" denied | | \$11.2 | \$8.8 | \$8.5 |
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If you take nothing else away from the presentation...



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If you take nothing else away from the presentation...



 Relatively hard to access equity via MEW (esp. HELOCs and HELoans)

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If you take nothing else away from the presentation...



 Relatively hard to access equity via MEW (esp. HELOCs and HELoans)

Really hard for minorities

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• Regress application denial indicator on race/ethnicity dummies and loan, property, and applicant risk factors, **X**.

$$Y_{it} = \beta_1 B lack_i + \beta_2 H ispanic_i + \beta_3 A sian_i + X_{it} \gamma + \eta_t + \lambda_l + \omega_s + \epsilon_{it}$$

- Positive race/ethnicity coefficients \Rightarrow discrimination assuming X includes all relevant risk factors. List of covariates
 - But, unobserved factors include: assets/liquid wealth, employment status and history, etc.

Can Observable Risk Factors Explain Denial Gaps?

| Dependent Var: Loan Denied (d) | | | | | | |
|--------------------------------|------------|------------|------------|------------|------------|------------|
| | (1) | (2) | (3) | (4) | (5) | (6) |
| Black (d) | 0.212*** | 0.192*** | 0.068*** | 0.065*** | 0.056*** | 0.042*** |
| | (0.022) | (0.019) | (0.008) | (0.008) | (0.005) | (0.004) |
| Hispanic (d) | 0.095*** | 0.092*** | 0.034** | 0.034** | 0.027** | 0.028*** |
| | (0.025) | (0.015) | (0.011) | (0.011) | (0.008) | (0.005) |
| Asian (d) | 0.076*** | 0.087*** | 0.073*** | 0.075*** | 0.058*** | 0.043*** |
| | (0.018) | (0.013) | (0.012) | (0.012) | (0.008) | (0.005) |
| Year FE | N | Y | Y | Y | Y | Y |
| State FE | N | Y | Y | Y | Y | Y |
| DTI Buckets | N | N | Y | Y | Y | Y |
| Credit Score Buckets | N | N | Y | Y | Y | Y |
| CLTV Buckets | N | N | N | Y | Y | Y |
| Other Controls | N | N | N | N | Y | Y |
| Lender FE | N | N | N | N | N | Y |
| # Observations | 12,638,969 | 12,638,969 | 12,638,969 | 12,638,969 | 12,638,969 | 12,638,969 |
| Adjusted R ² | 0.020 | 0.047 | 0.240 | 0.259 | 0.316 | 0.380 |
| Mean Denial Rate | 0.26 | 0.26 | 0.26 | 0.26 | 0.26 | 0.26 |

• *** p<0.001, ** p<0.01, * p<0.05.

• Standard errors double-clustered: state and lender.

- Unconditional B/W denial gap = 21 ppts.
- "Excess denials" of \sim 4 ppts remain.
 - Estimated \$2 billion in loan proceeds denied "in excess" over 4 years.
- Which controls matter most? Depends on order.

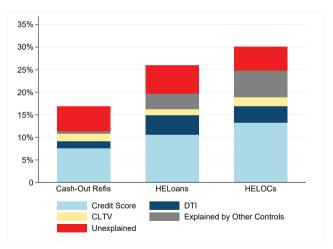
Results by Product Type

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Kitagawa/Oaxaca/Blinder (KOB) Decomposition (B/W Gaps)



- Credit score (40-45% of total B/W gap)
- Debt-to-income
- Combined loan-to-value ratio
- List of all covariates

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Results vary across different types of financial institutions

• Banks, credit unions, and nonbanks

- Minorities more likely to be denied across all product types and financial institutions.
- Denial rate gaps generally smallest at nonbanks
- B/W denial gap largest at credit unions (esp. HELoans and HELOCs)
- Some evidence that Hispanics and Asians fare better at minority-owned banks

Residual racial disparities (after controlling for observables in HMDA)



• (Al image generator) supposed to say "acknowledged" \Rightarrow my job is safe...for now

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Residual racial disparities (after controlling for observables in HMDA)



(Al image generator) supposed to say "acknowledged" ⇒ my job is safe...for now
 Discriminatory behavior or unobserved underwriting factors?

 (assets, employment history, etc.)
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Scope for lender discrimination may be larger in MEW.

- Standardized AUSs play a larger role in the purchase and rate-term refinance market segments.
 - Secondary market / securitization \Rightarrow formal/rigid reviews using common AUSs (e.g., Desktop Underwriter[©]).
- HELOCs and HELoans are often held in bank portfolios.
 - Internal underwriting models leave more room for subjective considerations.
- MEW borrowers more likely to apply in-person.
 - We provide some evidence in paper

Exercise

Are residual racial disparities driven **solely** by unobserved (to us) underwriting factors? \Rightarrow **NOT LIKELY** !

- Kitagawa-Blinder-Oaxaca decompositions by lender.
 - Are residual disparities greater at lenders with highest levels of explained disparities?
 - If Black applicants at a specific lender are very different on observables, they may also be very different on unobservables. (KOB)
- Control for AUS decision (only possible for cash-out refis)
 - Accounts for many underwriting factors not available in HMDA (AUS)
- Lender strictness correlated with residual disparities?
 - Lenders that rely more on factors not in HMDA data have larger racial disparities? Strictness
- Are magnitudes of residual disparities correlated with geographic variation in racial animus?

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Conclusion

- MEW products \rightarrow high denial rates (26% vs. 10% for non-MEW)
 - 44% among Black applicants, 32% among Hispanic
- Underwriting factors (esp. credit scores and DTI) explain a large portion of racial denial rate gaps
- Racial disparities in MEW are quantitatively important
 - Black applicants: \$11.2 (\$2) billion in unconditional (conditional) excess equity denied.
 - Hispanic borrowers: \$8.8 (\$2.2) billion.
 - Asian borrowers: \$8.5 (\$3.9) billion.
- ${\ensuremath{\, \bullet }}$ "Residual disparities" \rightarrow probably not driven solely by unobserved underwriting factors

SUPPLEMENTAL SLIDES

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Sample Summary Statistics

| | White | Black | Hispanic | Asian |
|--|-----------|-----------|-----------|---------|
| Income (thousands \$) | 118.1 | 93.1 | 102.3 | 147.8 |
| DTI (%) | 36.5 | 41.2 | 40.7 | 40.3 |
| Credit Score | 735 | 688 | 715 | 745 |
| CLTV (%) | 65.2 | 68.4 | 64.9 | 63.4 |
| Loan Amount | 185,529 | 166,378 | 195,211 | 264,885 |
| Units | 1.0 | 1.1 | 1.1 | 1.0 |
| Loan term (months) | 301 | 311 | 310 | 315 |
| Second Home (d) | 0.02 | 0.01 | 0.01 | 0.02 |
| Investment Property (d) | 0.04 | 0.06 | 0.06 | 0.10 |
| No Co-applicant (d) | 0.53 | 0.72 | 0.54 | 0.53 |
| Home Improvement (d) | 0.22 | 0.23 | 0.21 | 0.23 |
| Second Lien (d) | 0.30 | 0.27 | 0.28 | 0.35 |
| Prepayment Penalty (d) | 0.08 | 0.08 | 0.08 | 0.13 |
| Interest Only (d) | 0.16 | 0.09 | 0.11 | 0.15 |
| Other Nonamortizing Features (d) | 0.02 | 0.02 | 0.03 | 0.03 |
| Application to Minority-Owned Bank (d) | 0.001 | 0.001 | 0.002 | 0.009 |
| Application Denied (d) | 0.23 | 0.44 | 0.32 | 0.30 |
| # Observations | 9,572,670 | 1,011,791 | 1,184,479 | 870,39 |

Table: Descriptive Statistics for MEW Products

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Mean Values of Select Characteristics by Race Back

| | White | Black | Hispanic | Asian |
|--|-----------|-----------|-----------|--------|
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| Application to Minority-Owned Bank (d) | 0.001 | 0.001 | 0.002 | 0.009 |
| Application Denied (d) | 0.23 | 0.44 | 0.32 | 0.30 |
| Cash-Out Refinance (d) | 0.55 | 0.59 | 0.59 | 0.51 |
| HELoan (d) | 0.12 | 0.12 | 0.12 | 0.10 |
| HELOC (d) | 0.33 | 0.29 | 0.29 | 0.39 |
| # Observations | 9,572,670 | 1,011,791 | 1,184,479 | 870,39 |

Disparities in Access to Home Equity

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- Categorical variables:
 - $\bullet\,$ Credit score, CLTV, DTI, Household income, Loan amount, Loan term, # units
- Indicator variables:
 - Loan type (FHA, VA, GSE), Product type (HELOC, HELoan, Cash-out refi), Second lien, Home improvement loan, Prepayment penalty, Interest-only loan, Non-amortizing features, Second residence, Investment property, Co-applicant

Back (eqn.) Back (decompositions)

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Logit Models

| | (1) | (2) | (3) | (4) | (5) |
|----------------------|------------|------------|------------|------------|------------|
| Black | 0.212*** | 0.186*** | 0.059*** | 0.056*** | 0.046*** |
| | (0.007) | (0.010) | (0.005) | (0.005) | (0.003) |
| Hispanic | 0.095*** | 0.091*** | 0.031*** | 0.032*** | 0.024*** |
| | (0.010) | (0.010) | (0.009) | (0.008) | (0.006) |
| Asian | 0.076*** | 0.088*** | 0.073*** | 0.075*** | 0.054*** |
| | (0.006) | (0.004) | (0.005) | (0.005) | (0.006) |
| # Observations | 12,639,272 | 12,639,272 | 12,639,272 | 12,639,272 | 12,639,272 |
| Mean Denial Rate | 0.26 | 0.26 | 0.26 | 0.26 | 0.26 |
| Year FE | N | Y | Y | Y | Y |
| State FE | N | Y | Y | Y | Y |
| DTI Buckets | N | N | Y | Y | Y |
| Credit Score Buckets | N | N | Y | Y | Y |
| CLTV Buckets | N | N | N | Y | Y |
| Other Controls | N | N | N | N | Y |
| Lender FE | N | N | N | N | N |
| | | | | | |

Table: Logit Models of Denial for MEW Products

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Product Type Regressions

| | (1) | (2) |
|-------------------------|-----------|-----------|
| Black | 0.168*** | 0.040*** |
| | (0.023) | (0.004) |
| Hispanic | 0.045** | 0.016*** |
| | (0.014) | (0.004) |
| Asian | 0.017* | 0.026*** |
| | (0.007) | (0.003) |
| # Observations | 7,030,943 | 7,030,943 |
| Adjusted R ² | 0.015 | 0.289 |
| Mean Denial Rate | 0.18 | 0.18 |
| Year FE | Ν | Y |
| State FE | N | Y |
| DTI Buckets | N | Y |
| Credit Score Buckets | N | Y |
| CLTV Buckets | Ν | Y |
| Other Controls | Ν | Y |
| Lender FE | N | Y |

Table: Applicant Race and Likelihood of Denial: Cash-Out Refinances



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Product Type Regressions

| | (1) | (2) |
|-------------------------|-----------|-----------|
| Black | 0.259*** | 0.050*** |
| | (0.026) | (0.005) |
| Hispanic | 0.112*** | 0.032*** |
| | (0.017) | (0.004) |
| Asian | 0.085*** | 0.045*** |
| | (0.024) | (0.006) |
| # Observations | 1,479,900 | 1,479,900 |
| Adjusted R ² | 0.027 | 0.445 |
| Mean Denial Rate | 0.33 | 0.33 |
| Year FE | N | Y |
| State FE | N | Y |
| DTI Buckets | N | Y |
| Credit Score Buckets | N | Y |
| CLTV Buckets | N | Y |
| Other Controls | N | Y |
| Lender FE | N | Y |
| | | |

Table: Applicant Race and Likelihood of Denial: HELoans



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Product Type Regressions

| | (1) | (2) |
|-------------------------|-----------|-----------|
| Black | 0.301*** | 0.044*** |
| | (0.012) | (0.004) |
| Hispanic | 0.213*** | 0.046*** |
| | (0.021) | (0.006) |
| Asian | 0.133*** | 0.051*** |
| | (0.018) | (0.008) |
| # Observations | 4,128,076 | 4,128,076 |
| Adjusted R ² | 0.039 | 0.469 |
| Mean Denial Rate | 0.37 | 0.37 |
| Year FE | N | Y |
| State FE | N | Y |
| DTI Buckets | N | Y |
| Credit Score Buckets | N | Y |
| CLTV Buckets | Ν | Y |
| Other Controls | Ν | Y |
| Lender FE | N | Y |
| | | |

Table: Applicant Race and Likelihood of Denial: HELOCs



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Alternative Geographic Controls

| | | (1) | (2) | (3) | (4) |
|--|----------------------------|------------|------------|------------|------------|
| Hispanic 0.028*** 0.025*** 0.027*** 0.026*** (0.005) (0.004) (0.004) (0.004) (0.004) Asian 0.043*** 0.045*** 0.047*** 0.045*** (0.005) (0.005) (0.005) (0.005) (0.005) Year FE Y Y Y Y State FE Y Y Y Y DTI Buckets Y Y Y Y Credit Score Buckets Y Y Y Y ClTV Buckets Y Y Y Y Cltrus Buckets Y Y Y Y Clender FE Y Y N N Lender FE N N Y N County x Year FE N N Y N Observations 12,638,969 12,638,969 10,864,102 12,505,64: Adjusted R-squared 0.380 0.383 0.399 0.387 | Black | 0.042*** | 0.035*** | 0.035*** | 0.041*** |
| | | (0.004) | (0.003) | (0.003) | (0.003) |
| Asian 0.043*** 0.045*** 0.047*** 0.045*** (0.005) (0.005) (0.005) (0.005) (0.005) Year FE Y Y Y Y State FE Y Y Y Y DTI Buckets Y Y Y Y Credit Score Buckets Y Y Y Y CLTV Buckets Y Y Y Y Cltr Controls Y Y Y Y Lender FE Y Y N N Lender FTarct FE N N Y N County × Year FE N N Y N Observations 12,638,969 12,638,969 10,864,102 12,505,64: Adjusted R-squared 0.380 0.383 0.399 0.387 | Hispanic | 0.028*** | 0.025*** | 0.027*** | 0.026*** |
| (0.005) (0.005) (0.005) (0.005) Year FE Y Y Y Y State FE Y Y Y Y DTI Buckets Y Y Y Y Ordit Score Buckets Y Y Y Y Credit Score Buckets Y Y Y Y Other Controls Y Y Y Y Lender FE Y Y N N Lender FE N N Y N County X fear FE N N Y N Observations 12,638,969 12,638,969 10,864,102 12,505,647 Adjusted R-squared 0.380 0.383 0.399 0.387 | | (0.005) | (0.004) | (0.004) | (0.004) |
| Year FE Y Y Y Y Y Y Y Y Y Y Y Y Y Y Y Y Y Y DT State FE Y Y Y Y Y Y Y DT Duckets Y | Asian | 0.043*** | 0.045*** | 0.047*** | 0.045*** |
| State FE Y Y Y Y DTI Buckets Y Y Y Y DTI Buckets Y Y Y Y Credit Score Buckets Y Y Y Y CtTV Buckets Y Y Y Y Other Controls Y Y Y Y Lender FE Y Y N Y Census Tract FE N Y N N Lender × Tract FE N N Y N County × Year FE N N N Y Observations 12,638,969 12,638,969 10,864,102 12,505,642 Adjusted R-squared 0.380 0.383 0.399 0.387 | | (0.005) | (0.005) | (0.005) | (0.005) |
| DTI Buckets Y Y Y Y Credit Score Buckets Y Y Y Y CLTV Buckets Y Y Y Y Other Controls Y Y Y Y Census Tract FE N Y N N Lender × Tract FE N N Y N County × Year FE N N N Y Observations 12,638,969 12,638,969 10,864,102 12,505,642 Adjusted R-squared 0.380 0.383 0.399 0.387 | Year FE | Y | Y | Y | Y |
| Credit Score Buckets Y Y Y Y CLTV Buckets Y Y Y Y Other Controls Y Y Y Y Lender FE Y Y N Y Census Tract FE N Y N N Lender × Tract FE N N Y N County × Year FE N N N Y Observations 12,638,969 12,638,969 10,864,102 12,505,64: Adjusted R-squared 0.380 0.383 0.399 0.387 | State FE | Y | Y | Y | Y |
| CLTV Buckets Y Y Y Y Other Controls Y Y Y Y Lender FE Y Y N Y Census Tract FE N Y N N Lender × Tract FE N N Y N County × Year FE N N N Y Observations 12,638,969 12,638,969 10,864,102 12,505,647 Adjusted R-squared 0.380 0.383 0.399 0.387 | DTI Buckets | Y | Y | Y | Y |
| Other Controls Y Y Y Y Lender FE Y Y N Y Census Tract FE N Y N N Lender × Tract FE N Y N N Lender × Tract FE N N Y N County × Year FE N N N Y Observations 12,638,969 12,638,969 10,864,102 12,505,642 Adjusted R-squared 0.380 0.383 0.399 0.387 | Credit Score Buckets | Y | Y | Y | Y |
| Lender FE Y Y N Y Census Tract FE N Y N N Lender × Tract FE N N Y N County × Tract FE N N Y N County × Year FE N N N Y Observations 12,638,969 12,638,969 10,864,102 12,505,642 Adjusted R-squared 0.380 0.383 0.399 0.387 | CLTV Buckets | Y | Y | Y | Y |
| Census Tract FE N Y N N Lender x Tract FE N N Y N County x Year FE N N N Y Observations 12,638,969 12,638,969 10,864,102 12,505,64 Adjusted R-squared 0.380 0.383 0.399 0.387 | Other Controls | Y | Y | Y | Y |
| Lender x Tract FE N N Y N County x Year FE N N Y N Observations 12,638,969 12,638,969 10,864,102 12,505,64 Adjusted R-squared 0.380 0.383 0.399 0.387 | Lender FE | Y | Y | N | Y |
| County × Year FE N N Y Observations 12,638,969 12,638,969 10,864,102 12,505,643 Adjusted R-squared 0.380 0.383 0.399 0.387 | Census Tract FE | N | Y | N | N |
| Observations 12,638,969 12,638,969 10,864,102 12,505,64 Adjusted R-squared 0.380 0.383 0.399 0.387 | Lender × Tract FE | N | N | Y | Ν |
| Adjusted R-squared 0.380 0.383 0.399 0.387 | $County \times Year \; FE$ | Ν | Ν | Ν | Y |
| 5 | Observations | 12,638,969 | 12,638,969 | 10,864,102 | 12,505,642 |
| Mean Denial Rate 0.26 0.26 0.26 0.26 | Adjusted R-squared | 0.380 | 0.383 | 0.399 | 0.387 |
| | Mean Denial Rate | 0.26 | 0.26 | 0.26 | 0.26 |

Back

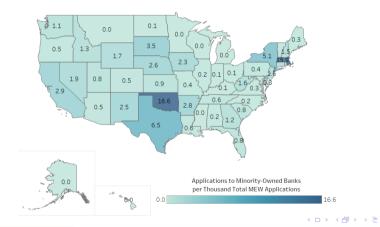
Disparities in Access to Home Equity

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Minority-Owned Bank Shares

• A lot of geographic heterogeneity in market shares of minority-owned banks.



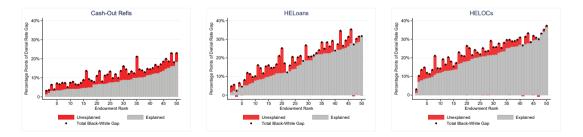
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Face-to-face Interactions More Likely in MEW Space

- Use feature of HMDA data reporting instructions to calculate a proxy for in-person lending.
- During application process lenders must impute each applicant's race, ethnicity, and gender "based on visual observation or surname" if the applicant declines to supply that information on the application AND the lender meets with the applicant in person prior to closing.
 - Rate of imputation among applicants who don't supply information (\sim 20%) is good indicator of frequency with which applications are taken in-person.
 - Lenders imputed race on 46% of HELOC and 31% of HELoans applications where borrowers refused to provide information.
 - $\bullet\,$ Only 7% for cash-out and rate/term refis and 13% for purchase loans.

${\sf Unobservables?} \to {\sf Lender} \ {\sf Decompositions}$

- Top 50 largest lenders for each MEW product type. Back
- Lender-level B/W KOB decomposition.
 - Sort lenders by size of "explained" component.



• Size of "explained" component not highly correlated w/ size of "unexplained" component.

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Unobservables? \rightarrow **AUS Recommendation** (Bhutta et al. (2022)) (cash-out refis) Back

| | (1) "AUS Denial" | (2) Application Denial without AUS Outcome Control | (3) Application Denial with AUS Outcome Control |
|-------------------------|---------------------|--|---|
| Black | 0.020*** | 0.037*** | 0.027*** |
| | (0.003) | (0.004) | (0.003) |
| Hispanic | 0.006*** | 0.013*** | 0.010*** |
| | (0.002) | (0.003) | (0.003) |
| Asian | 0.007*** | 0.023*** | 0.020*** |
| | (0.001) | (0.002) | (0.002) |
| AUS "Denial" | | | 0.464*** |
| | | | (0.025) |
| Year FE | Y | Y | Y |
| State FE | Y | Y | Y |
| DTI Buckets | Y | Y | Y |
| Credit Score Buckets | Y | Y | Y |
| CLTV Buckets | Y | Y | Y |
| Other Controls | Y | Y | Y |
| Lender FE | Y | Y | Y |
| AUS "Denial" | Ν | Ν | Y |
| # Observations | 6,138,590 | 6,138,590 | 6,138,590 |
| Adjusted R ² | 0.203 | 0.208 | 0.311 |
| Mean Outcome | 0.08 | 0.13 | 0.13 🗖 🕞 🖌 🐇 |

Conklin (UGA)

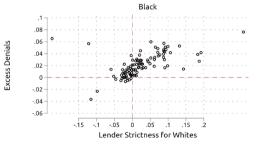
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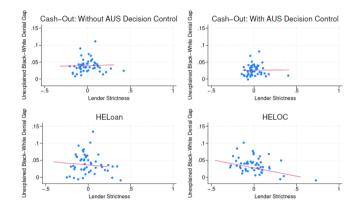
Unobservables? \rightarrow Lender Strictness (Bhutta et al. (2022)) Back

- Obenial regression for White borrowers only → lender FE capture "lender strictness" (lenders focus on factors not observed in HMDA)
- ② Relationship between lender-level residual racial disparities and lender strictness



Purchase + Refi (source: Bhutta, Hizmo, Ringo, 2023)

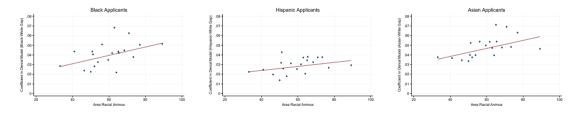
Unobservables? \rightarrow Lender Strictness in MEW (top 50 lenders) \rightarrow No relationship between lender strictness for Whites and B/W Denial Gap



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Minority denial gaps are positively correlated with location's level of racial animus (Back)

- Media markets' level of racial animus (Stephens-Davidowitz, 2014).
 - Google search queries only focused on racial animus toward Black individuals.



- Positive correlation between "unexplained" denial rate gaps and racial animus at CBSA level ⇒ consistent with discrimination being a factor.
 - 1-std-dev \uparrow in media market racial animus \Rightarrow 1.0 ppt \uparrow in Black-White denial gap.