

# Discussion of “Internal Loan Ratings, Supervision, and Bank Leverage”

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<sup>1</sup> The views expressed in this presentation are those of the author and do not necessarily reflect the views of the Federal Reserve Board or the Federal Reserve System.

## Research questions

# Research questions and predictions

- Investigate whether banks systematically assign biased internal loan ratings
- **Main research questions:**
  - Do banks systematically assign biased internal loan ratings?
  - What impact does regulatory supervision have on these ratings?
  - How do internal loan ratings affect bank leverage across economic cycles?
- **Setting:**
  - Uses Shared National Credit (SNC) Program data
  - Uses large syndicated loans (above \$100M) shared by multiple financial institutions
  - Exploits conditional random assignment of loan examinations
  - Multiple banks rate identical loans, enabling comparison of ratings for the same credit risk
- The paper finds evidence of systematic ratings inflation, supervisory effectiveness in improving ratings accuracy, and ratings inflation contributing to the procyclicality of bank leverage

## Research questions

## Main contribution

- CSI data, interesting setting, and important findings with clear policy implications
  - Supervisory examinations produce significant positive externalities
  - Information spillovers suggest optimized examination targeting could enhance efficiency
  - More frequent examinations during economic expansions could reduce procyclical effects
- Main limitations: the sample focuses on large syndicated loans that are subject to supervisory evaluation and oversight

## Research questions

# Economic rationale for regulatory loan review

- What are the incentives of supervisors and lenders?
  - *Supervisors*: Ensure safety and soundness
  - *Loan examiners*: Review loan portfolios (expertise, career concerns and reputation concerns)
  - *Regulated syndicated lenders (banks subject to SNC supervision)*: Profitable lending subject to regulatory and liquidity constraints
  - *Unregulated syndicated lenders*: Profitable lending subject to liquidity constraints (and potential learning from regulated syndicate members)
- The paper focuses on the drift in rating and the feedback from supervisory rating changes on future ratings and lending

## Recommendation 1

## Mechanism

- The paper documents a downward drift in ratings (approximately 0.07 grade per year)
- But provides limited explanation of the specific mechanism assuming that the rating drift is due to overly high ratings at loan origination
  - Ratings inflation is *predictable* from pre-issuance characteristics and particularly pronounced for:
    - Lower-quality loans
    - Higher utilization rates
    - Non-investment grade borrowers
  - Suggests information available during screening is not fully incorporated into initial ratings
  - However, why are banks making these loans that seem to be systematically graded too high?
  - Why would a bank lend to a borrower that has a loan grade below 'pass' at loan origination?
  - Are there specific incentives at the syndicate level?

## Recommendation 1

## Mechanism (cont.)

- What are the incentives for providing higher ratings at loan initiation?
  - **Top rating is pass:** Pass rating has three categories
    - 1 Investment Grade,
    - 2 Non-Investment Grade, or
    - 3 Lowest-Graded Pass
  - Given that most of the ratings are in the pass category, it would be helpful to delineate between the three ratings
  - Consider whether grade inflation is more likely in one of these categories
  - Link back to the literature on SNC loan examination intensity (Ivanov and Wang, 2024)
  - Clarify whether a loan can have a non-pass rating at initiation

## Recommendation 1

## Mechanism (cont.)

- What is the underlying link between an adverse SNC rating on a particular loan and increased supervisory scrutiny?
- What assumptions do we need to make about banks' choosing a loan portfolio in equilibrium to identify changes in a loan-level rating by a supervisor to lead to bank changing their credit portfolio or credit rating?
  - Relationship banks have repeated interactions with borrowers and other syndicate members. What is the role of monitoring in this setting (Gustafson et al. 2021)?
  - One adverse rating appears to have significant changes on the affected bank's willingness to lend to this borrower in the future (Ivanov and Wang, 2024)

## Recommendation 1

## Mechanism and supervision intensity

- Utilize more the richness of the data on supervisory ratings
  - Currently pooling three pass ratings together
  - More adverse ratings have a larger direct impact on bank's provisions, profitability, and capital
- Provide more information on banks existing incentives in the presence of regulatory oversight
  - How persistent is the effect of a negative supervisory rating?
  - What is the long-term regulatory cost to a bank from incurring negative ratings?
  - If loan rating changes are more predictable for worse borrowers, are these risks not priced by the banks (link to the tests using interest rate spreads)?
- Provide additional tests on bank outcomes
  - Do changes in lending result in banks' improving the quality of their assets or loan portfolio overall?
  - Do banks change overall monitoring, syndicated loan market participation or lending to riskier borrowers?

## Recommendation 2

## Estimation and sample construction

- The authors use multiple additional datasets and link them with SNC
- Difficult to follow how the additional datasets were linked and to how many observations:
  - SNC-DealScan match is required for loan characteristics at origination
  - SNC-CRSP and SNC-Compustat match is required for borrower-level characteristics
  - Call Reports are used for bank-level characteristics
  - Examination frequency changes in 2016 and examined loan amount threshold changes in 2019
  - Main sample includes the financial crisis and several business cycles
- It is unclear how different each sample is and how it affects inferences
- What mechanism would provide incentives to reduce internal ratings inflation?

## Recommendation 2

## Estimation and sample construction (cont.)

- **Sample size:** Consider providing more color on sample construction and include a table with sample changes and the number of observations for various subsamples
- **Matching:** Matching SNC to various other datasets is a process, consider providing some more color on how good these matches are and what assumptions were made to construct these subsamples
- **Borrower characteristics:** CRPS and Compustat mostly include public firms. Are these firms more likely to have investment grade (pass) ratings than private firms? Consider evaluating the subsample of private borrowers
- **Sample changes:** The sample period includes the financial crisis and several business cycles. Consider utilizing this more directly for your inferences on procyclicality

## Recommendation 3

## Inferences

- The authors carefully discuss their identification strategy and provide robustness tests
- Some causal inferences would benefit from further clarification
  - Table V is interpreted that borrower characteristics at loan origination predict future ratings drift (or rating downgrades)
  - Tables VII and VIII are comparing regulatory or bank ratings. The interpretation of the counterfactual is unclear
- Implications for loan loss provisions and regulatory changes (e.g., CECL)
- Loan loss provision simulations rely on standardized assumptions that may not reflect heterogeneous banking practices
- **Suggestions:**
  - Estimation sample sensitivity: alternative windows, placebo dates
  - Consider matching treated and control banks on the balance sheet and profitability metrics
  - Exclude banks with other supervisory scrutiny (e.g., stress tested banks)
  - Explore dynamic effects: Do these spillovers persist over time and over the credit cycle?

## Additional comments

## Minor comments and suggestions

- Figure 1 is the only one within the text and it is referenced after Figures 2-4, consider moving it together with the rest of the figures to avoid confusion
- How might changes in accounting standards (e.g., CECL) affect ratings inflation incentives?
- Do banks with different business models exhibit different patterns of ratings inflation?
- Do you observe any differences across loan types?
- Can you utilize other measures of risk (e.g., PDs) to evaluate alternative risk ratings?
- Can you exclude banks that are subject to additional supervisory scrutiny (e.g., stress tested banks)?
- References to the literature need to be expanded to include other related papers (e.g., Gustafson et al., 2021) and updated (e.g., Ivanov and Wang, 2024)
- Interpretation on market leverage and stock return volatility is unclear

## Summary and conclusion

## Conclusion

- Interesting paper providing new evidence on potential inflation in banks' internal loan ratings
  - Important contribution to understanding supervisory effects on internal loan rate inflation
  - Novel evidence showing existence of inflation and its mitigation by supervisory oversight
  - Clear policy implications
- Clarifying the mechanism, acknowledging limitations, and providing a more careful discussion about the sample construction and inferences, will further enhance the contribution and impact of the paper