Loan Officers Impede Graduation from Microfinance: Strategic Communication in a Large Microfinance Institution

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Graduation programs offer promising route to increasing the impact of microfinance

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 - Loan officers implicitly penalized when good borrowers graduate out of their portfolio

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- We document that these organizational features are common amongst MFIs

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- Objective lower the costs of endorsements to study if incentive structure was generating a meaningful problem

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- Randomized survey timing around a policy change may be a useful design for other experiments within firms

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 - Only endorsements received at Mitigation and Recognition predict repayment and business growth in GL

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 - For ML, we observe all borrowers for at least one loan cycle

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 - Default rate for borrowers endorsed after compensation change $17\%^{**}$
 - $\bullet\,$ Fondo collected an extra ${\sim}\$275^{**}$ on average from graduated borrowers endorsed after the compensation change

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 - Non-graduated borrowers endorsed in mitigation and recognition do not experience business growth

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- These are the costliest borrowers for the ML loan officers to lose
- Consistent with this, non-graduated borrowers endorsed after mitigation and recognition had better repayment in the ML portfolio

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 - $\bullet\,$ Of MFIs with graduation programs, 31%-54% also satisfy points 2-4 $\,$

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- From org econ perspective, this is an unusually direct exploration of strategic communication inside a firm