

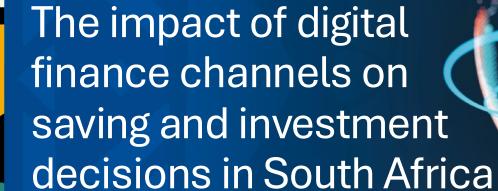


Sustainability



Committee on Payments and Market Infrastructures





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\*The views expressed here are those of the authors and not necessarily those of the Bank for International Settlements (BIS) or South African Reserve Bank (SARB).

### Context: lack of retail investment participation and savings is a problem

#### Households:

- Fewer opportunities to build wealth
  - Non-participation in risky markets leads to lower retirement wealth and lifetime consumption (Gomes and Michaelides, 2005)
- Limited ability to buffer shocks
  - Lack of access to formal savings  $\rightarrow$  lower income growth and higher income volatility (World Bank, 2014)
- Ongoing concentration of wealth and inequality (IMF, 2021)

#### Financial markets:

- Lower market depth (BIS,2019) Foreign capital dependence
- - Higher volatility in bond yields and larger capital outflows during shocks (BIS, 2014)
- Overreliance on public finance for pension

  Higher long-term fiscal burden (OECD, 2020)
  Financial stability
- - Ability to absorb shocks (Federal Reserve, 2024)

## Why could digital finance channels help?

- Participation costs are too high
- Improved and lower cost access:
  - Lower fees → higher participation (Omri, Kogan, and So, 2020)
  - Reduced travel costs in rural areas (World Bank, 2015)
  - Ability to safely store money digitally → higher savings

(Dupas and Robinson, 2012)

#### Investing is too complicated

- Behavioural nudges and simplification:
  - Auto-saving and goal-based savings → increase savings rates
  - (Gargano and Rossi, 2024)
  - Real-time balance → enhance trust
  - (Bachas et al., 2019)
  - Robo-advising → mitigate behavioral biases
  - (D'Acunto, Prabhala, and Rossi, 2019; Chak et al., 2022)



### Contribution

- Evidence on population level
  - Previous studies focus on existing app users or small focus groups.

    D'Acunto, Prabhala, and Rossi, 2019; Chak et al., 2022, Omri, Kogan, and So, 2020
- Include a wider range of financial decisions
  - Previous studies analyze a single financial aspect (e.g., credit access, saving rates, or app adoption).
     Agarwal et al., 2020; Berg et al., 2020, Gargano and Rossi, 2024
  - Include a wider range of financial decisions, including debt's role in savings.
  - Examine savings allocation and quality(e.g., formal savings, long-term goals, diversification).

Research question: How do digital finance channels affect saving and investing behaviour in South Africa?

# South Africa as a highly relevant jurisdiction to study digital finance

#### **Developed financial sector**

- Financial sector that is among the most developed in Africa: 23.5% to GDP in 2021, and the banking sector had total assets worth R6.8 trillion (USD 374.8 billion)
- Well-established capital market: Johannesburg Stock Exchange (JSE) ranking among the top 20 largest globally
- 97% adult South Africans accessed some form of formal financial product or service in 2021

#### High mobile phone penetration

- Mobile phone ownership: 96.1% of households owned at least one mobile phone in 2023
- Internet access: 78.6% of households had internet access, but data costs remain high
- Fintech regulatory sandbox launched in 2020

#### Important structural challenges

• High unemployment (32.1%), highest Gini coefficient globally (World Bank), low savings rate (CEIC), the five largest banks hold 90% of total assets (National Treasury, 2023)

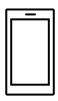
### Finmark Trust data

- Independent non-profit focused on financial inclusion in South Africa
  - Widely used by South African Reserve Bank (SARB), Financial Sector Conduct Authority (FSCA) and other regulators
- Annual waves from 2019, 2021–23
  - Extension: Includes data from 2013–18
  - Representative of the South African population
    - ~5,500 individuals annually, 21,839 total observations
- Extensive demographic and socioeconomic information





### Finmark Trust data

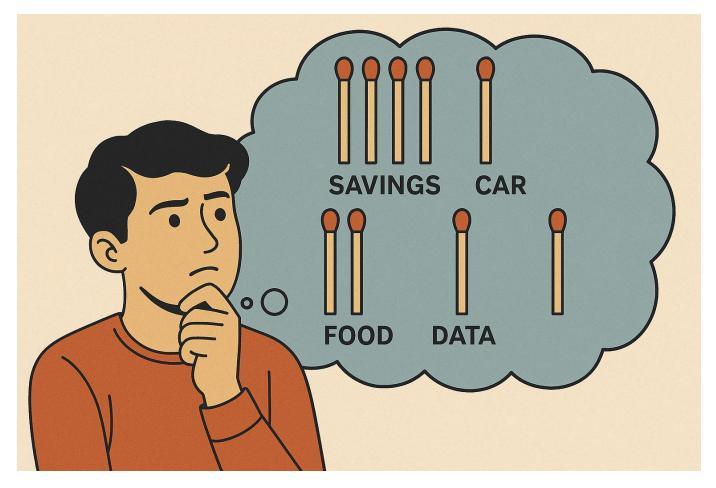


- Digital finance variables:
  - Digital Finance behavior
    - Mobile banking, send/receive via mobile
  - Bank Choice
    - Fintech-only users, fintech and traditional users



- Saving outcomes:
  - Saves, allocation to savings, number of saving methods, proportion using formal methods, portion receiving advice, proportion saving for long-term goals, rainy day fund

## **Spending Allocation**





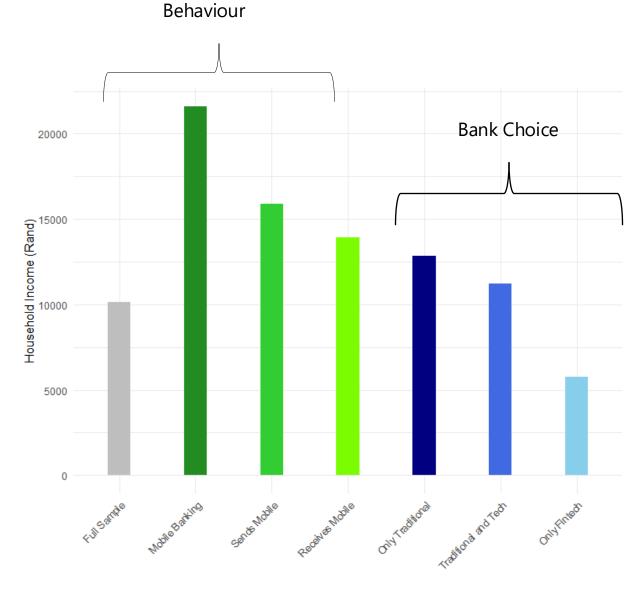
# Descriptives

<u>Variable</u>	Obs	Mean	Std. dev.
Age (Years)	21,836	39.17	14.59
Male	21,836	0.43	0.50
Education (1-6)	21,736	2.85	1.34
Household Income adj. (Rand)	20,689	10,128	11,631
Urban	21,837	0.47	0.50
Black	21,841	0.47	0.50
White	21,841	0.13	0.33
Mobile Banking	18,654	<mark>0.14</mark>	0.35
Sending Mobile	7,054	<mark>0.40</mark>	0.49
Receiving Mobile	7,277	<mark>0.40</mark>	0.49
Only Traditional	21,839	0.65	0.48
Only Fintech	21,839	<mark>0.01</mark>	0.12
Both Traditional and Fintech	21,839	<mark>0.01</mark>	0.11
Saves	21,839	0.38	0.49
Number of saving methods	21,839	0.82	1.87
Proportion formal (%)	8,397	0.48	0.45
Proportion of long term goals (%)	11,035	0.31	0.43
Proportion of saving methods with advice (%)	4,771	0.25	0.47
Has rainy day fund	21,835	0.31	0.46



## Who adopts?

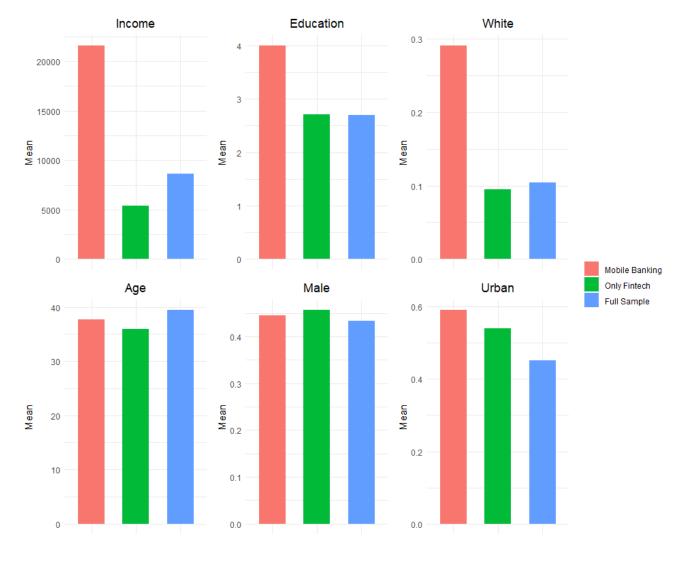
- Digital behaviours (eg mobile banking and payments) and fintech bank adoption (traditional and fintech) involve different groups.
- Digital behaviour users tend to have higher incomes.
- Users with only fintech have lower incomes.



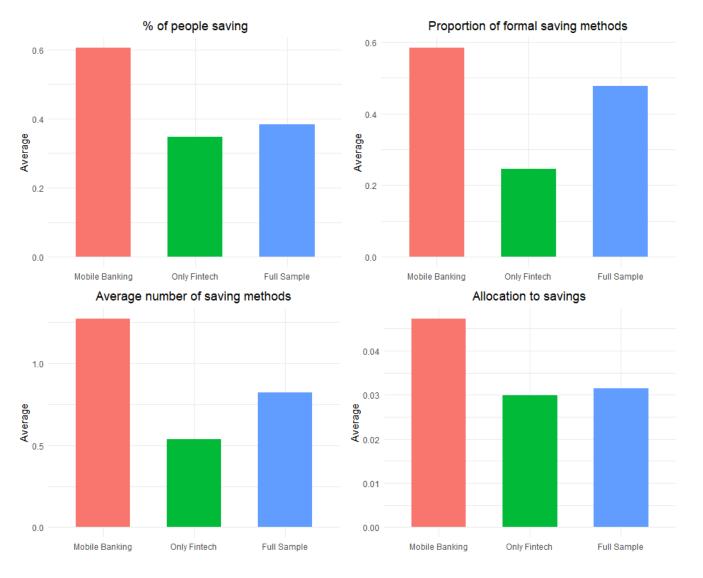
Mean income by digital adoption measure

## Demographic Differences among adopters

- Digital channel adopters are higher-income, more educated, and predominantly white.
- Fintech-only users are lowerincome, less educated, and predominantly black.
- Both groups are younger than average, more urban, and slightly more male.



## Savings, digital behaviour and banking choice





# Users of mobile banking and payments are more likely to save

- Probit regression with controls for income, age, gender, education, urbanization, race, and year and province fixed effects.
- Income and education strongly predict outcomes in all specifications.

Probit		Sa	ves (Saving	methods	>0)	
	(1)	(2)	(3)	(4)	(5)	(6)
Mobile banking	0.152***					
	(10.36)					
Sending mobile		0.086***				
		(4.99)				
Receiving mobile			0.081***			
			(5.00)			
Only fintech				-0.008		
				(-0.18)		
Only traditional					0.157***	
					(16.17)	
Both traditional and fintech						0.076*
						(1.81)
Pseudo R-Squared	0.058	0.051	0.059	0.051	0.060	0.051
N	11,623	3,873	3,941	11,623	11,623	11,623
					M	

# These users are also more likely to save formally, and through more methods

OLS		F	Proportion	on form	al		OLS		Numb	er of sav	ing meth	nods	
	(1)	(2)	(3)	(4)	(5)	(6)		(1)	(2)	(3)	(4)	(5)	(6)
Mobile banking	0.033**	•					Mobile banking	0.344***					
	(2.51)						J	(5.62)					
Sending mobile		0.005					Sending mobile		0.251***	:			
		(0.28)					_		(3.10)				
Receiving mobile			0.036**				Receiving mobile			0.190**			
			(2.11)							(2.49)			
Only fintech				-0.077			Only fintech			(2.49)	-0.349*		
				(-1.51)			Only lintech				(-1.83)		
Only traditional					0.023*		Only traditional				( 1.03)	0.452***	
-					(1.74)		Offiny traditional					(9.54)	
Both traditional and							Both traditional					(3.31)	
fintech						0.090**	and fintech						0.158
						(2.13)							(0.83)
R-squared	0.381	0.379	0.375	0.381	0.381	0.381	R-squared	0.046	0.061	0.053	0.044	0.051	0.043
N	5,131	2,159	1,922	5,131	5,131	5,131	N	11,623	3,873	3,941	11,623	11,623	11,623

# ... as well as to have a rainy-day fund and allocate more to savings

Probit		На	as rainy d	day fund			OLS		Allocati	on savin	gs		
	(1)	(2)	(3)	(4)	(5)	(6)		(1)	(2)	(3)	(4)	(5)	(6)
Mobile banking	0.058***						Mobile banking	0.006***					
	(4.37)						J	(4.06)					
Sending mobile		0.029*					Sending mobile		0.007***				
		(1.70)					3		(3.64)				
Receiving mobile			0.023				Receiving mobile			0.003*			
			(1.51)				Receiving mobile			(1.74)			
Only fintech				0.032			Only fintech				0.003		
				(0.85)	0.00044		Offig fifiteeri				(0.61)		
Only traditional					0.088**		Only two ditional				` ,	0.010***	
					(9.67)		Only traditional					(10.40)	
Both traditional and					( /		Both traditional and					(10.10)	
fintech						0.049	fintech						-0.002
						(1.32)	micen						(-0.42)
Pseudo R-Squared	0.081	0.056	0.068	0.080	0.084	0.080	R-squared	0.066	0.066	0.061	0.063	0.069	0.063
N	11,623	3,873	3,941	11,623	11,623	11,623	N	11,622	4,497	4,732	14,641	14,641	14,641
								Com and	mittee on Payments Market Infrastructures	BIS	South African Reserve Ban		15

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# Qualitative Evidence - Discussions with regulators and practitioners

- Structural barriers: low income, no savings capacity, high banking costs, high minimum deposits
- Cash-based economy: cash-only transport and merchants, high ATM fees, preference to hold cash
- **Informal economy:** strong trust in stokvels, culturally ingrained practices
- Infrastructure: expensive, unreliable internet and electricity

### Future extensions

### Identification:

- Are observed effects due to digital channels or individuals with better financial habits being more likely to adopt?
- Can use the cost of internet as an instrument for adoption
  - Data costs from providers are generally uniform across the country, regardless of location
     → but number of providers/competition varies
- Access to fiber internet varies significantly across regions
  - Not always correlated with economic activity → townships next to wealthy areas

### Model:

- Identify the barriers to adoption, quantify their costs and evaluate their impact on the likelihood of adopting digital finance channels
- Which factors have the most significant influence on adoption ("what moves the needle")?

## Future extensions



## Conclusion

- Adoption by underserved groups is rising but doesn't appear to have led to substantial changes in savings or investment behaviour.
- Benefits are largest for already well-served individuals.
- Identification is needed to see if adoption drives behaviour or reflects existing financial habits.
- Insights will show if technology improves decisions or amplifies pre-existing tendencies.





### Case studies

### Case studies:

- M-Pawa: Goal-setting features led to 3 times higher savings compared to a control group.
- Juntos Finanzas & Bancolombia: Savings reminders and nudges increased account balances by 50%.
- Caixinhas (Nubank):
   Achieved 1.7 million active customers post-release and tripled user base from December 2022 to December 2023.

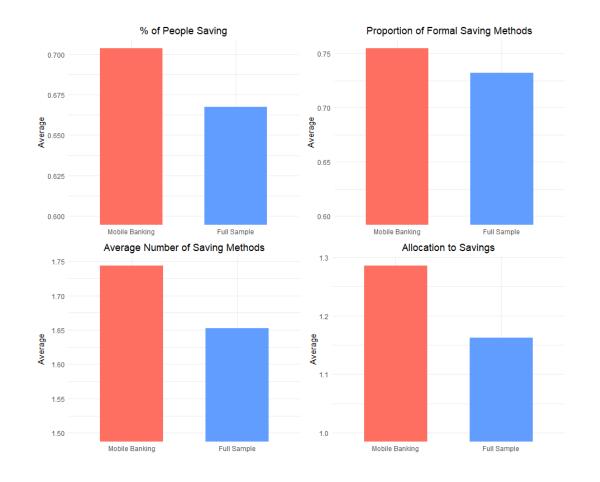
## Who adopts? Regression results

	Mobile banking	g Sending mobile	Receiving mobile	Only fintech	Only traditional	Both traditional and fintech
	(1)	(2)	(3)	(4)	(5)	(6)
Log household income (adj)	0.333***	0.188***	0.145***	-0.101***	0.286***	0.073**
	(17.20)	(7.77)	(6.89)	(-3.03)	(19.07)	(2.09)
Age group 18 - 34	0.169	-0.005	0.292*	-0.120	0.542***	0.379
	(1.10)	(-0.02)	(1.65)	(-0.52)	(4.93)	(1.03)
Age group 35 - 54	0.001	-0.188	0.165	-0.158	0.521***	0.245
	(0.01)	(-0.75)	(0.93)	(-0.69)	(4.77)	(0.67)
Age group > 55	-0.244	-0.411	-0.067	-0.640**	-0.021	-0.219
	(-1.52)	(-1.58)	(-0.36)	(-2.51)	(-0.19)	(-0.56)
Male	0.011	-0.008	0.034	0.092	0.423***	0.210***
	(0.31)	(-0.19)	(0.77)	(1.29)	(13.67)	(2.96)
Education	0.163***	0.246***	0.194***	-0.086**	0.235***	0.029
	(11.71)	(13.25)	(10.43)	(-2.56)	(15.83)	(0.96)
Urban	0.125***	0.178***	0.206***	0.196*	0.036	0.088
	(2.78)	(2.78)	(3.48)	(1.96)	(0.92)	(0.84)
Coloured	0.061	0.102	0.129*	-0.357**	-0.093**	0.058
	(1.09)	(1.29)	(1.88)	(-2.47)	(-2.15)	(0.50)
Asian	0.113	0.200	0.106	0.181	-0.081	-0.301
	(1.59)	(1.56)	(0.96)	(1.23)	(-1.11)	(-1.42)
White	0.332***	0.462***	0.335***	0.085	0.187***	-0.149
	(7.48)	(6.65)	(5.23)	(0.83)	(3.71)	(-1.42)
Province FE	Yes	Yes	Yes	Yes	Yes	Yes
Year FE	Yes	Yes	Yes	Yes	Yes	Yes
Pseudo R-Squared	0.184	0.145	0.098	0.112	0.185	0.121
N	9,751	3,711	4,008	12,054	12,054	12,054

# How much of that can be explained by income and education?

 Only the people in the highest income quintile and highest education category

Small differences still persist





## Additional results - Saving

OLS		Alloc	ation de	bt repay	ment		OLS	Pro	Proportion saving vs. debt repayment						
	(1)	(2)	(3)	(4)	(5)	(6)		(1)	(2)	(3)	(4)	(5)	(6)		
Mobile banking	0.002* (1.82)						Mobile banking	0.020 (0.54)							
Sending mobile		0.004*** (2.58)					Sending mobile		0.054 (1.13)						
Receiving mobile			0.000 (0.11)				Receiving mobile			0.017 (0.32)					
Only fintech				0.000 (0.02)			Only fintech				-0.050 (-0.36)				
Only traditional					0.004*** (5.05)		Only traditional					0.051 (1.41)			
Both traditional and fintech						-0.002 (-0.59)	Both traditional and fintech						-0.168 (-1.23)		
R-squared N	0.067 11622	0.100 4497	0.069 4732	0.063 14641	0.064 14641	0.063 14641	R-squared N	0.027 2684	0.050 1138	0.046 994	0.029 3043	0.029 3043	0.029 3043		

## Additional results - Saving

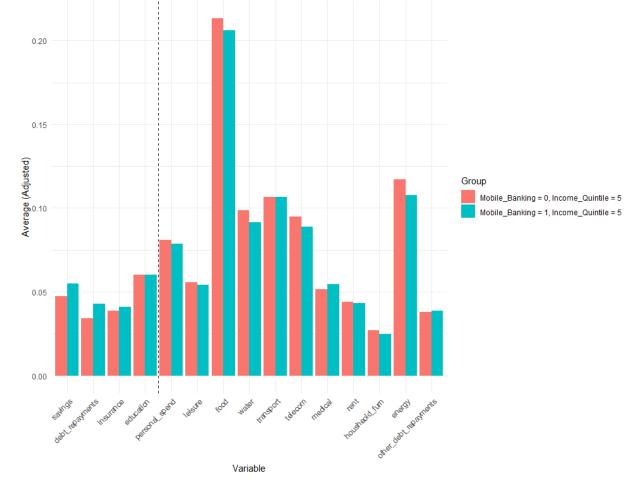
OLS			Proportion	on advice			OLS		А	llocation	other de	ebt	
	(1)	(2)	(3)	(4)	(5)	(6)		(1)	(2)	(3)	(4)	(5)	(6)
Mobile banking	0.020 (1.37)						Mobile banking	0.152*** (4.11)	*				
Sending mobile		0.005 (0.25)					Sending mobile		0.148*** (3.37)				
Receiving mobile			0.006 (0.30)				Receiving mobile			0.087** (2.10)			
Only fintech				0.102 (1.34)			Only fintech				-0.004 (-0.03)		
Only traditional					0.019 (1.07)		Only traditional					0.301*** (11.98)	
Both traditional and fintech						0.152*** (3.16)	Both traditional and fintech					,	-0.047 (-0.43)
R-squared	0.336	0.334	0.314	0.336	0.335	0.337	R-squared	0.059	0.066	0.062	0.049	0.057	0.049
N	3280	1489	1247	3280	3280	3280	<u>N</u>	11622	4497	4732	14641	14641	14641

## Additional results - Saving

Probit			Has b	udget			Probit			Currentl	y saving		
	(1)	(2)	(3)	(4)	(5)	(6)		(1)	(2)	(3)	(4)	(5)	(6)
Mobile banking	0.292*** (7.38)						Mobile banking	0.215*** (5.43)					
Sending mobile		0.010 (0.21)					Sending mobile		0.089* (1.91)				
Receiving mobile			0.110** (2.40)				Receiving mobile			0.091** (2.16)			
Only fintech				0.087 (0.73)			Only fintech				0.271** (2.37)		
Only traditional					0.241** <sup>*</sup> (8.16)	k	Only traditional					0.413*** (16.90)	
Both traditional and fintech						0.424*** (3.17)	Both traditional and fintech						0.066 (0.58)
R-squared <u>N</u>	0.113 11623	0.084 3873	0.112 3941	0.109 11623	0.114 11623	0.110 11623	Pseudo R-squared N	0.043 11623	0.047 4498	0.060 4732	0.054 14642	0.068 14642	0.054 14642

## Spending allocation – highest-income quintile

 Mobile banking group allocates more to financial categories (eg savings and debt)



## Spending Allocation – Lowest Income Quintile

- Large disparity on food
- Gap on telecom is larger than gap on savings

