## Investor Expertise and Private Investment Selection

Shane Miller<sup>1</sup> Emmanuel Yimfor<sup>2</sup> Ye Zhang<sup>3</sup>

<sup>1</sup>University of Michigan <sup>2</sup>Columbia University <sup>3</sup>Stockholm School of Economics

2024 IPC Research Workshop Series

### Growth of Accredited Individual Investors in Private Markets

#### Bloomberg

Businessweek | In Depth

#### The Rich Investor Club Is Getting Crowded

More US households than ever qualify as accredited investors. Asset managers are thrilled, but democratization has downsides.





Nustration: Timo Lenzen for Bloomberg Businessweek



PERSONAL FINANCE

# Inflation gives millions new access to investments for the wealthy, says SEC

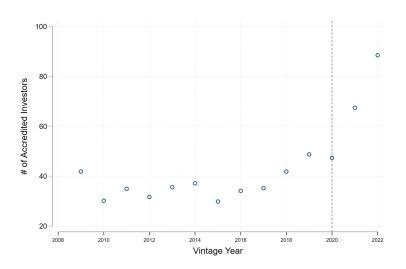
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#### KEY

- The number of "accredited" investors swelled to 24 million in 2022, the SEC said. That's 8 million more than in 2019, and the number is poised to keep growing.
- Accredited investors can buy private securities such as private equity, hedge funds and venture capital funds. They generally meet financial requirements that to net worth or a negular income.
- Private investments used to be earmarked for roughly the top 2%. Now, about 1 in 5 households can buy them.

# Growth of Accredited Individual Investors in Private Markets



Despite the rapid growth of individual investors in private markets, little is known about their private market investment patterns.

This Paper: Provides the first empirical evidence of how private-market investments by individual investors differ from those of professionals

Setting: Focus on the venture capital (VC) fund selection process

### Empirical Challenges:

- Lack of data on individual investors' investment patterns
- Hard to separate VC fund access from VC fund selection

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# Empirical Method: Survey Experiments with US LPs

Participants: 593 institutional and 445 individual accredited US limited partners (LPs)

• Individual LPs: Have experience investing in VC funds

**Incentives:** Offer free due diligence on general partners (GPs) from CEPRES, a leading private market investment technology platform

#### **Survey Experiment**

- Recruitment: Between June and August 2023
- Design: Follows Lyons-Padilla et al. (2019)
  - LPs evaluate a single one pager with *randomly* assigned GP teams with characteristics generated using a *randomized factorial* approach to decide whether they want to invest in them

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## Example Pager Displayed to Participants

- The first document that reaches a I P's desk
- GPs' characteristics are
- I Ps' evaluations

### EXPONENT CAPITAL

\$250 MILLION - EXPONENT CAP III, LP

#### The Opportunity

- Fund Name: Exponent Cap III, LP.
- Target Size:
- \$250 Million Portfolio Construction: 20-25 companies, investing \$1-10M each. For companies that take off, we maintain reserves for follow on round:

#### Track Record

Fund I, \$75M (2011 vin.) Net IRR: -10.6% | TVPI: 0.62x

15 investments, 2 successful exits, 5 investments money-back

Fund II, \$150M (2014 vin.) Net IRR: -9.2% | TVPI: 0.56x

20 investments, 2 successful exits, 6 investments money-back

#### OUR INVESTMENT TEAM

The Exponent team brings together a unique blend of complementary skill sets and networks, which positions us well for successfully running our third VC fund.



#### Nathan Phillips, Managing Partner

Nathan previously served as the Chief Executive Officer of Cyenia. Also cofounded Dynamos Inc. with a focus on innovation and creativity. Princeton University graduate.



#### Benjamin Cook, Venture Partner

Benjamin founded Vertexia to provide innovative solutions to a variety of challenges in the market. California Institute of Technology graduate.



#### Victor Anderson, Principal

Victor built Nexodus from scratch, with a focus on delivering the best possible customer experience. University of California Los Angeles graduate

Managing Director investors@ExponentCap.vc

Los Angeles, CA

It is not our interest to provide any information about any current or future offering. Any information provided herein is intended to be general information about our management and business model and historical data only.

## Example Pager Displayed to Participants

- The first document that reaches a LP's desk
- GPs' characteristics are orthogonally randomized.
- LPs' evaluations
  - a. Mechanisms (network matching, return, risk)
  - b. Decisions (investment interest, amount)

Evaluation Questions

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# Finding 1: Both Value Better Returns and Networks...

Dependent Variable:	Profession	al Investors	Individua	Investors	
	Investment Interest Q <sub>5</sub>	Investment Amount Q <sub>6</sub>	Investment Interest $Q_5$	Investment Amount Q6	
	(1)	(2)	(3)	(4)	
Network Evaluations Q <sub>1</sub>	6.90*** (1.08)	0.66*** (0.16)	3.66** (1.16)	11.69** (4.30)	
Matching Evaluations Q <sub>2</sub>	0.31 (0.86)	-0.07 (0.17)	0.87 (1.28)	2.34 (2.17)	
Return Evaluations Q <sub>3</sub>	14.46*** (1.08)	1.72*** (0.28)	14.90*** (1.48)	3.47 (4.14)	
Risk Evaluations Q <sub>4</sub>	-2.28** (0.89)	-0.07 (0.16)	1.15 (1.12)	0.15 (3.49)	
$R^2$	0.541	0.214	0.713	0.083	
Observations	593	571	445	445	

- Both institutional LPs and individual LPs value VC funds with higher expected returns and better networks
- This is the ex-ante expected behavior investment interest/amount question design insulates decisions from matching beliefs, all else equal higher returns and one of their primary drivers (network quality) are desirable to all investors
- Suggests the results are unlikely to be noise

# Finding 2: ...But Differ in Beliefs on GP Characteristics

### Institutional LPs prefer

- GPs with better past financial performance
- GPs with entrepreneurial experience
- seasoned VC funds

Consistent with VC performance indicators documented in the literature

Dependent Variable:	Investment Interest	Investment Amount	Investment Interest	Investment Interest
	1{Qs Above Median}	1{Q <sub>6</sub> Above Median}	1{Q <sub>7</sub> Above Median}	1{Q <sub>8</sub> Above Median
	(1)	(2)	(3)	(4)
Top Performing Fund	0.27*** (0.04)	0.22*** (0.04)	0.07* (0.04)	0.02 (0.04)
VC Exp	-0.01 (0.05)	-0.04 (0.05)	0.01 (0.05)	-0.04 (0.05)
Entrepreneurial Exp	0.11** (0.05)	0.13** (0.05)	0.04 (0.05)	0.02 (0.05)
Connection	0.05 (0.04)	0.08** (0.04)	-0.00 (0.04)	0.06 (0.04)
Prestigious School	0.04 (0.04)	0.04 (0.04)	0.02 (0.04)	0.12*** (0.04)
Western Coast	0.02 (0.04)	0.04 (0.04)	-0.01 (0.04)	0.02 (0.04)
First Time Fund	-0.08** (0.04)	-0.08** (0.04)	-0.06 (0.04)	-0.00 (0.04)
$\mathbb{R}^2$	0.060	0.057	0.031	0.018
Observations	1,038	1,038	1.038	1.038

# Finding 2: ...But Differ in Beliefs on GP Characteristics

#### Individual LPs slightly prefer

 Investors without entrepreneurial experience

#### Individual LPs:

- Do not weight past financial performance of GPs
- Do not prefer seasoned funds

Importantly, individual investors do not systematically value past financial performance of GPs (robust to specification).

Dependent Variable:	Investment Interest $1{Q_S \text{ Above Median}}$	Investment Amount $1{Q_6}$ Above Median}	Investment Interest $1\{Q_7 \text{ Above Median}\}$	Investment Interest $1\{Q_8 \text{ Above Median}$
	(1)	(2)	(3)	(4)
Top Performing Fund ×	-0.31***	-0.22***	-0.14**	-0.01
Individual Investor	(0.06)	(0.06)	(0.06)	(0.06)
VC Exp ×	-0.09	-0.04	-0.01	0.00
Individual Investor	(0.08)	(0.08)	(0.08)	
Entrepreneurial Exp ×	-0.24***	-0.14*	-0.22***	-0.10
Individual Investor	(0.08)	(0.08)	(0.08)	(0.08)
Connection ×	-0.08	-0.13**	-0.01	-0.10
Individual Investor	(0.06)	(0.06)	(0.06)	(0.06)
Prestigious School ×	-0.03	-0.03	0.06	-0.10
Individual Investor	(0.06)	(0.06)	(0.06)	(0.06)
Western Coast ×	0.01	0.02	0.16** (0.06)	0.01
Individual Investor	(0.06)	(0.06)		(0.06)
First Time Fund ×	0.13**	0.05	0.11*	0.08
Individual Investor	(0.06)	(0.06)	(0.06)	(0.06)
Individual Investor	0.25*** (0.09)	0.28*** (0.09)	0.04 (0.09)	0.10 (0.09)
R <sup>2</sup>	0.060	0.057	0.031	0.018
Observations	1,038	1,038	1,038	1,038

# Finding 2: ...And Differ in Beliefs on Return Mechanisms

### Institutional LPs expect

in the literature

 Top performing GPs to have better networks and returns with less risk, but less likely to accept investment

Western Coast 0.08\*\* -0.06 -0.01 (0.04)(0.04)(0.04)First Time Fund Seasoned funds reduce risk -0.03 (0.04) (0.04) -0.05 0.031 0.025 0.051 Observations 1.038 1.038 1.038 Again, consistent with VC performance drivers documented

Denendent Variable

1{Q1 Above Median} 1{Q2 Above Median} 1{Q<sub>3</sub> Above Median} 1{Q4 Above Median} (1) (2) (3) (4) Top Performing Fund (0.04) (0.04) (0.04) (0.04) VC Evo 0.08 0.06 0.04 0.03 (0.05) Entrepreneurial experience Entrepreneurial Exp 0.00 0.12\*\* 0.03 (0.05)(0.05) to contribute to network Connection 0.06 0.05 -0.04(0.04) (0.04)(0.04) (0.04) Prestigious School and returns 0.05 -0.06 0.01 0.01 (0.04)(0.04)(0.04)(0.04)0.03 (0.04)0.14\*\*\* 0.034 1.038

Network Evaluations

Panel B-1: Investment Mechanism Ratings (Professional)

Matching Evaluations

Return Evaluations

Risk Evaluations

# Finding 2: ...And Differ in Beliefs on Return Mechanisms

### Individual LPs expect:

- Top performing GPs to have similar networks, returns, and risk, and no difference in likelihood to accept investment
- Entrepreneurial experience does not contribute to network and returns
- First time funds have better returns (offsetting higher risk)

Fully offsets most professional investor beliefs, access beliefs inconsistent with data

Dependent Variable:	Network Evaluations	Matching Evaluations	Return Evaluations	Risk Evaluations
	$1{Q_1 \text{ Above Median}}$	1{Q2 Above Median}	1{Q <sub>3</sub> Above Median}	1{Q <sub>4</sub> Above Median
	(1)	(2)	(3)	(4)
Top Performing Fund ×	-0.18***	0.16*** (0.06)	-0.24***	0.16***
Individual Investor	(0.06)		(0.06)	(0.06)
VC Exp ×	-0.18**	-0.07	-0.13	-0.12
Individual Investor	(0.08)	(0.08)	(0.08)	(0.08)
Entrepreneurial Exp ×	-0.21***	0.04	-0.18**	-0.05
Individual Investor	(0.08)	(0.08)	(0.08)	(0.08)
Connection ×	-0.05	0.00	-0.06	0.04
Individual Investor	(0.06)	(0.06)	(0.06)	(0.06)
Prestigious School ×	-0.05	0.13**	0.01	-0.00
Individual Investor	(0.06)	(0.06)	(0.06)	(0.06)
Western Coast ×	0.01	0.11*	0.11*	-0.04
Individual Investor	(0.06)	(0.06)	(0.06)	(0.06)
First Time Fund ×	0.12*	-0.08	0.11*	-0.02
Individual Investor	(0.06)	(0.06)	(0.06)	(0.06)
Individual Investor	0.22**	-0.15*	0.13	0.00
	(0.09)	(0.09)	(0.09)	(0.09)
R <sup>2</sup>	0.031	0.025	0.051	0.034
Observations	1,038	1,038	1,038	1.038

## What Explains Individual Investors' Investment Patterns?

### Investment experience!

- Individual investors with more investment experience value VC funds with better past financial performance
- Consistent with the institutional LPs' patterns and the well documented "persistent performance of VC funds" phenomenon

#### Panel A: Investment Interest Ratings

Dependent Variable:	Investment Interest	Investment Amount	Investment Interest	Investment Interest
	Qs	$Q_6$	Q <sub>7</sub> (High Quality)	Q8 (Low Quality)
	(1)	(2)	(3)	(4)
Top Performing Fund × Experienced Individuals	13.88*** (5.06)	0.05 (0.10)	2.65 (4.55)	13.68** (5.89)
Top Performing Fund	-2.18 (2.11)	-0.01 (0.06)	-2.63 (2.10)	-2.50 (2.52)
Experienced Individuals	-17.70** (8.45)	-0.17 (0.15)	-10.02 (7.23)	-29.71*** (9.54)
R <sup>2</sup>	0.083	0.047	0.051	0.113
Observations	445	445	445	445

#### Panel R: Mechanism Evaluations

Dependent Variable:	Network Evaluations	Matching Evaluations	Return Evaluations	Risk Evaluations
	$Q_1$	$Q_2$	$Q_3$	$Q_4$
	(1)	(2)	(3)	(4)
Top Performing Fund × Experienced Individuals	13.64*** (4.43)	1.05 (4.43)	11.39** (4.98)	4.61 (4.30)
Top Performing Fund	-3.57* (2.11)	-1.85 (2.15)	-2.14 (2.21)	-1.61 (2.40)
Experienced Individuals	-11.09 (6.91)	-4.43 (6.34)	-15.57* (8.05)	-4.83 (6.10)
R <sup>2</sup>	0.067	0.032	0.079	0.056
Observations	445	445	445	445

# Finding 3: Understanding Adverse Selection

# GP-LP market is a two-sided matching market

- Institutional investors take adverse selection into consideration
  - Realize that better performing funds are less likely to collaborate with them due to better outside options
- Individual investors stated beliefs do not reflect this (and experience doesn't correct matching beliefs)

Dependent Variable:	Ma	Matching: $1\{Q_2 \text{ Above Median}\}$						
	Seasone	d Funds	All F	unds				
	OLS	Probit	OLS	Probit				
	(1)	(2)	(3)	(4)				
Top Performing Fund × Individual Investor	0.22** (0.09)	0.58** (0.24)	0.16*** (0.06)	0.42*** (0.16)				
Top Performing Fund	-0.23*** (0.06)	-0.59*** (0.15)	-0.15*** (0.04)	-0.38*** (0.10)				
Individual Investor	-0.25** (0.12)	-0.65** (0.31)	-0.15* (0.09)	-0.39* (0.23)				
R² (Pseudo R²)	0.058	0.043	0.025	0.045				
Observations	1,038	1,038	1,038	1,038				

# Summary: Experimental Results

- All investors want to invest with funds with better expected returns, and understand the importance of networks in private markets investing
- Investors differ in stated beliefs about which GP characteristics predict high returns and good networks
- Individual investors do not state a belief in limited access to successful funds or the adverse selection concerns with funds they can access

#### Questions Raised

- How large are these results economically?
- What drives differences in stated beliefs?

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## Implication 1: Investment Performance

**Key Difference:** Professional investors highly value past GP performance, whereas individual investors do not.

Calibrate the implications of fund selection differences on their investment performance

- Use the persistence of performance in VC funds measured in prior work
   A transition matrix in Table 3 in Harris, Jenkinson, Kaplan, and Stucke (2023)
- Use the collected experimental data to calibrate demand differences
   Indicate how likely professional and individual investors would invest in VC funds with different past financial performance.

When the expected returns are measured using IRR, the expected returns for VC funds demanded by professional investors are 19.52%; those for individual investors are 17.36%

A 2% difference is comparable in magnitude to the average risk-adjusted out-performance of VC funds (Korteweg (2019), regardless of risk-adjustment method).

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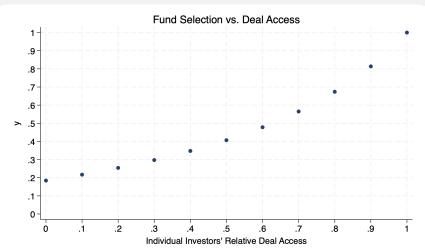
### Observational Data: Investment Performance of Individual LPs

- Fund Performance Data: Pitchbook
- # of Individual LPs (fund-level): scrape Form D from the SEC website

Consistent with the experiment, VC funds likely to be backed by more individual LPs exhibit poorer financial performance.

Dependent Variable:	P(IPO/Acq)	P(IPO)	P(Acq)	P(Closures)
	(1)	(2)	(3)	(4)
Ln(Accredited Investors)	-0.019**	-0.027***	0.008	0.004
	(0.007)	(0.007)	(0.005)	(0.004)
VC Exp	0.018	-0.009	0.027*	-0.009
	(0.021)	(0.018)	(0.015)	(0.009)
Entrepreneurial Exp	-0.008	0.006	-0.015	0.017***
	(0.013)	(0.012)	(0.010)	(0.006)
Connection	-0.048***	-0.063***	0.015	0.002
	(0.018)	(0.014)	(0.015)	(0.009)
Prestigious School	-0.001	-0.004	0.003	0.004
	(0.015)	(0.010)	(0.012)	(0.007)
Western Coast	0.003	0.004	-0.001	0.005
	(0.012)	(0.010)	(0.009)	(0.006)
First Time Fund	0.035*	0.016	0.019	-0.005
	(0.018)	(0.016)	(0.013)	(0.008)
Ln(Fund Size)	0.039***	0.045***	-0.006	-0.020***
	(0.005)	(0.005)	(0.004)	(0.004)
Observations	662	662	662	662
Adjusted R <sup>2</sup>	0.606	0.202	0.602	0.368
Vintage Year FE?	YES	YES	YES	YES

# Implication 2: Importance of Fund Selection vs Deal Access



- y-axis: relative importance of fund selection
- x-axis:individual LPs' relative access to high-track-record GPs
- fund selection alone could explain 20% of the performance gap details

### • Are the results surprising?

(Public Market) Retail investors have various behavioral biases (overconfidence, over-trading, trend-following, over-extrapolation, etc.).

(private market)

 Angel investors exhibit superior investment performance in the public market using Norwegian data (Karlsen, Kisseleva, Mjos, and Robinson 2023)

### • Any policy implications?

(Frictionless, Full-information Economy) Increased access to private markets would unambiguously increase welfare and improve the efficiency of allocations

This paper: The welfare impact of expanding access to private market investments is not unambiguously positive (mis-allocation, over-allocation possible).

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(private market)

- Angel investors exhibit superior investment performance in the public market using Norwegian data (Karlsen, Kisseleva, Mjos, and Robinson 2023)
- Any policy implications?

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# Individual investors in VC markets seem to display different behavioral biases than retail investors in public markets:

- Under-weighting past performance (this study), versus over-extrapolation (public markets)
- Failure to incorporate well-documented market facts (performance persistence, access, preferential LP treatment), possibly consistent with public markets

- Test for overconfidence (survey expected knowledge, followed by private markets financial literacy quiz)
- Prime basic market facts (answers to private markets financial literacy quiz, multiple one-pager evaluations)
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- Research Question: How do investments by individual investors and those of professionals differ in the private market? (VC fund selection process)
- Empirical Method: Survey experiment with US individual and institutional LPs
- Findings
  - Both groups aim to select high-performing VC funds but differ in their beliefs about which GP characteristics predict high returns.
  - Professionals prefer GPs with strong past returns, while individuals place much less emphasis on VC funds' past performance
    - Individuals do not take access and adverse selection into consideration
    - Investment experience matters.
    - Individual investors are associated with worse investment performance.
  - Results suggest that even as access barriers fall, differences in fund selection may perpetuate performance gaps between individual and professional LPs.

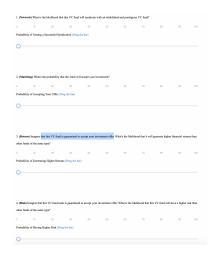
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## **Evaluation Questions**





investing in th	e fund?								
	10	20	30	40	50	60	70	80	90
Probability of	Investment	(Drag the bar)							
0									
6. If you are p	denning to d	iepłay \$25 mill	ion in VC cap	ital this year, he	w much would	you allocate to t	his fund consid-	oring that its tan	get size is \$250
million?									
Note: TV711	i.e., "Tetal ?	Albar to Paid-In	Capital'i is i	alculated by div	iding the curre	nt value of the fi	naf's portfolio b	v the total armo	ant of capital th
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boen called or fand.  1. After an init that their stage  1. Probability of  2. After an init assistance that	paid in by I tial meeting schol TVPI	inited partners with the GPs,  20 (Drug the bur)  with the GPs,	is in the following to the transfer of the tra	ing free question hey are open to 1 40 hey are open to to	ng, It is a common and allocation for the state of the st	nen perfermace  on yes. Further,  d yes consider e  co	emetric used to sogniher with 5 midding an alloca 20	measure the re- rear consultantes  00	tern en investm , year team esti

# Implication 1: Fund Performance (Calibration Process)

Transition Matrix from Harris, Jenkinson, Kaplan, and Stucke 2023

		С	urrent Fu	nd Quarti	le
Fund Quartile at Fundraise	1	-	2 23.6%	•	4 12.2%
	4	10%	20%	26%	44%

- $E(r) = Pr(Selecting Better-Performing Funds) \times r_{Top-quantile Performance} + Pr(Selecting Worse-performing Funds) \times r_{Bottom-quantile Performance}$
- Pr(Selecting Better(Worse)-Performing Funds) is from experimental data ( $Q_5$ )
- $r_{\text{Top(Bottom)-quantile Performance}}$  is from the transition matrix
- standard errors are calculated by bootstrapping. back

# Implication 2: Importance of Fund Selection vs Deal Access

### Step 1: calculate the performance gap driven solely by fund selection

(In the experiment, institutional and individual LPs have the same access to all GPs)

As shown in the one-pages in the experiment

- GPs with high track records have an average TVPI of 4.9
- GPs with low track records have an average TVPI of 0.59

Based on the experiment, institutional (individual) investor would invest in

- higher-track-record GPs with a probability of 0.62 (0.51)
- lower-track-record GPs with a probability of 0.38 (0.49)

Hence, Institutional investors' expected TVPI:  $0.62 \times 4.9 + 0.38 \times 0.59 = 3.26$  Individual investors' expected TVPI:  $0.51 \times 4.9 + 0.49 \times 0.59 = 2.79$  performance gap driven solely by fund selection is 3.26 - 2.79 = 0.47

# Implication 2: Importance of Fund Selection vs Deal Access

### Step 2: calculate the performance gap driven by both fund selection and fund access

(x = 0.1: assuming institutional investors have access to all GPs; individual investors have access to all lower-track-record GPs and 10% of higher-track-record GPs.)

- Individual investors' expected TVPI:  $\frac{(0.51\times4.9\times0.1+0.49\times0.59\times1)}{(0.51\times0.1+0.49\times1)}=0.996$
- the performance gap becomes 3.26 0.996 = 2.264

#### Step 3: calculate the role of fund selection

The y-axis is 0.47/2.264 = 0.21 (i.e., performance gap caused by fund selection divided by performance gap caused by both fund selection and deal access) back