



The 2023 HEC Paris-DowJones Venture Capital Performance Ranking

by Prof Oliver Gottschalg

Executive Summary

The 2023 HEC Paris - DowJones Venture Capital Performance Ranking lists the world's Top VC firms who cumulatively raised between over \$100M over a decade in terms of aggregate performance based on all their Venture capital funds raised between 2010 and 2019.

This ranking answers the question: "Which firm(s) in the Venture Capital segment generated the best performance for their investors over the past years?" The ranking draws on a comprehensive set of data on PE fund performance sourced from Preqin and directly from PE Firms and uses a unique methodology to calculate the aggregate performance of a PE firm based on different performance measures for all the funds managed by this firm. The method is able to aggregate performance across vintage years and considers relative and absolute returns. In total, we analyzed performance data from 505 Venture Capital firms and the 947 funds they raised between 2010 and 2019 with an aggregate equity volume of \$194B.

The Venture Capital Ranking

Rank	Firm	Performance Score
1	Earlybird Digital East Fund	5.64
2	Blackbird	2.11
3	MindWorks Capital	2.04
4	BY Crypto Management	2.00
5	Medicxi Ventures	1.59
6	BA Capital	1.33
7	Co-Win Ventures	1.30
8	Visionary Venture Fund	1.27
9	Heartcore Capital	1.10
10	Northzone	1.08
11	NEXT Investors	1.01
12	G Squared	0.98
13	Alta Partners	0.96
14	M13	0.90
15	Alpha JWC Ventures	0.89
16	TLV Partners	0.88
17	GRC	0.86
18	Storm Ventures	0.82
19	True Ventures	0.80
20	Battery Ventures	0.77

Introduction

The Private Equity industry is notorious for being opaque and access to any data is chronically difficult. In particular, little is known about the performance and competitive behaviour of the key PE Firms. While performance rankings exist for many other areas (the best 'business school', the best 'place to work', the best 'stock market analyst' etc), nothing worth that name exists in PE. Until recently, the only available rankings for Private Equity were based on size alone, which has very limited meaning. Since 2009, HEC Paris and DowJones have joined forces to publish regular rankings of PE Firms based on their historic performance and expected future competitiveness respectively.

Simply Speaking, what does the performance ranking mean?

This ranking answers the question: "Which firm(s) generated the best performance in its segment for their investors over the past years?" It draws on performance information from all buyout funds managed by a given PE Firm and aggregates their performance based on a novel and proprietary methodology (see below) into one overall performance score.

What are the data sources behind the rankings?

To obtain a most accurate picture of the universe of PE Firms and their investments, we drew on a variety of available databases and performed a number of

cross-checks of the information used in this study. We used the Preqin PE fund performance database as the primary database for fund performance information, in addition to an increasing amount of information directly provided by PE Firms to HEC for the purpose of these rankings.

While HEC has access to additional proprietary information on the activity and performance of PE Firms (HEC Buyout Database), this data is anonymous and cannot be used for this study.

How have the evaluated PE Firms been selected?

We gathered data, as of August 2024, on the universe of VC firms worldwide on which preqin provides performance data or which provided data directly to HEC for the purpose of the performance rankings. This results in a sample of 505 PE firms and the 947 funds they raised between 2009 and 2018 with an aggregate equity volume of \$159bn. From this starting sample, we selected all those PE firms that met the following objective criteria:

- At least 2 funds which raised over the 2010 to 2019 period for which full performance information is available;
- Performance data available on all of these the funds
- Over \$100m raised during this time;
- Investments in US, EU or global
- At least 10 observation years (i.e. the sum of the 'age' of all funds as of today);

Why these selection criteria?

It is our intention to focus the analysis to PE Firms that represent the Venture-Cap segment of the Private Equity universe, defined based on their cumulative fundraising volume over the relevant vintage decade. Also, we want to make sure that we exclude GPs who only disclose returns of their best performing funds and that we do not report any 'one-hit-wonders', hence the requirement to have at least 2 funds with full performance information and 10 'observation years'. We do not consider funds raised 2020 or later, as their performance is still too unreliable to be judged at this point.

How large and representative is your sample of PE Firms?

The 188 firms that passed the criteria raised total equity of over \$108bn through 562 funds between 2010 and 2019.

How has the aggregate past performance been assessed?

Private Equity is an asset class that makes it particularly challenging to assess the aggregate performance of a given PE Firm. Performance is typically recorded at the fund-level (and not for the entire PE Firm). Furthermore, three factors make the aggregation of performance to the firm-level challenging:

1. Alternative, complementary performance measures are used to assess performance (e.g. IRR vs. Return Multiple), so that it is not trivial to know what measure to look at.
2. People disagree whether firms should be assessed according to their absolute performance or based on the performance relative to a performance benchmark.
3. Private Equity Firms typically manage a number of limited-life funds raised at different vintage years simultaneously and the so-called J-Curve phenomenon makes it difficult to say, whether a 4-year-old fund with a 15% IRR is better or worse than a 7-year-old fund with a 20% IRR.

In a project sponsored by advisory firm PERACS GmbH, Prof. Oliver Gottschalg from HEC School of Management, has developed a proprietary methodology that makes it possible to comprehensively assess the aggregate performance of all funds managed by a Private Equity Firm. The basis for this assessment is the performance of each fund, measured in terms of three complementary performance measures: IRR, DPI (cash-only return multiple) and TVPI (a return multiple that considers accounting values of ongoing investments). We assess performance in each measure both as absolute values and measured against the corresponding performance benchmark, leading to $2 \times 3 = 6$ performance indicators.

These six indicators are then combined for multiple funds based on a proprietary statistical method that considers the empirically-derived historical reliability of performance measured at a given 'fund age' as weights. The intuition for this method is as follows: We determined empirically the reliability of performance of funds that are 2, 3, 4... years old. Our sample included detailed data on the evolution of the performance of 492 actual buyout funds over time. Imagine, the performance of a 3-year-old fund predicts its final performance with 35% accuracy, while the performance of a 5-year-old fund predicts its final performance with 70% accuracy. We would then give twice as much weight to performance data of 5-year-old funds than to the performance data of 3-year-old funds in the aggregation. Finally, we combine all six performance measures to a single performance score¹ using a standard statistical method called 'Principal Component Analysis'. This makes it possible to compare the overall value creation ability of Private Equity Firms across all their funds.

¹The extracted factor has an Eigenvalue of 5.1 and captures 86% of the total variance of all 6 performance measures.

How to Interpret the 'Aggregate Performance Score'?

The aggregate performance score is neither an IRR-type annual return measure nor a money multiple. It can only be interpreted relative to the average aggregate performance score of all firms we analyzed: An aggregate performance score of 1 means that a given PE Firm has an aggregate performance that is one 'standard deviation' above the average performance, which would position it typically at the 85% percentile, i.e. 85% of all firms would have a lower aggregate performance. Also, an aggregate performance score of 2 means that performance is twice as high as for an aggregate performance score of 1. A PE Firm with the average performance has (by design) an aggregate performance score of 0.

As the average and the standard deviation for each of the samples underlying our different PE Rankings are different, it is not possible to compare PE Firms across the different rankings based on their score. In other words a mid-market firm with a score of 1.2 is not necessarily better performing overall than a small-cap firm with a score of 1.1.

How sensitive are the results to the valuation of unrealized investments?

The valuation of unrealized investments has only a small impact on the rankings. First, we only consider funds that are at least four years old. Second, according to our methodology, young (with relatively more unrealized investments) funds carry less weight in the performance aggregation than older funds, as we consider that the performance of younger funds is inherently less precise. Finally, two of our six individual performance measures (DPI) consider cash-on-cash performance only and ignores valuations of unrealized investments.

What does the ranking not capture?

The Performance Ranking is backward-looking by definition. It cannot capture recent changes in the strategy, the core team or the fund/deal size of a PE Firm. As such, it may not capture all elements of the current competitiveness of a given PE Firm.



Limitations

The confidential nature of the PE industry makes it impossible to compose a 100% accurate database on private equity and we cannot exclude the possibility of biases in our results due to missing or inaccurate information. However, we rely on the same data sources typically used to compose industry-standard statistics of PE activity and we consider our data by far the 'best available' for this kind of analysis.

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