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Measuring Long Term Superior Performance

The UK's Long-Term Superior Performers 1984–2003

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This article examines the issue of determining long-term sustained superior financial performance. We demonstrate that the technique of frontier analysis is a robust and theoretically consistent way to identify relative performance. We show how our approach, although dependent on the reliability of reported financial data (which recent events show needed to be treated with caution for some companies), addresses the three critical issues in the measurement of performance: balancing short-term and long-term performance, capturing the multidimensional nature of performance, and finding the right peer comparators. The approach is particularly important today, given the failure of past performance to signal in any way how firms would be able to weather a pervasive global crisis.

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Academics and practitioners would both agree that the primary job of senior management is to manage for sustainable long-term performance that results in superior returns for the owners of the firm's assets (i.e., shareholders), while also meeting the claims of other stakeholders. However many studies have noted that few companies manage to achieve such long-term superior performance.¹ This article argues that the difficulties managers face in *sustaining* long-term performance arise not just from a competitive environment that naturally flattens out a firm's performance profile, but also from the inherent problems in accounting for the multidimensional character of performance as it is commonly *understood* and *measured*. To understand superior sustained performance, one requires a theoretically consistent and robust understanding of what it means to perform.²

This article proposes an approach for characterising performance that accounts for the major dilemmas in determining what it means to be a superior financial performer. This question

has been at the forefront of strategic thinking for decades, and has come to the fore, not just in terms of theory - e.g., what does it mean to have sustainable competitive advantage — but also in terms of practice — e.g., in going from ‘good to great’, what is meant by ‘good’ and ‘great’. Characterising sustained superior performance requires dealing with three specific challenges: (1) how to balance long versus short term performance, (2) how to address the issue of the existence of multiple, perhaps conflicting, measures of performance, and (3) how to determine what the relevant basis of comparison should be. Each is discussed below, and their practical implications discussed in [Exhibit 1](#) using GE as an example.

Challenge 1 - balancing short-term and the long-term performance

Although managers face the challenge of managing for both short-term and long-term performance,³ most measures focus primarily on short-term performance; a few years at most and only a few quarters in some cases. Even with supposed longer-term future looking measures, such as share prices, the length of the time horizon is itself subject to the collective foresight of investors and the length of that foresight. Even academics are not immune to this tendency: the majority of academic studies rely on cross-sectional analyses, and when longitudinal analysis is conducted performance is normally construed narrowly.⁴

Challenge 2 - the conflicts between different measures of performance

The advent of the balanced scorecard and similar approaches has signalled wide acceptance of the idea that managers should be evaluated on multiple measures of performance.⁵ However, no one has yet come up with a robust way of doing this and addressing the critical questions of what those measures should be, and how managers or analysts should balance different measures, particularly when they conflict.

Challenge 3 - finding the right peer comparators

Performance needs to be measured not just against what the company itself has done in the past, but also against comparable companies - managers do this, as do analysts. But they may use quite different comparators than might be found in academic studies, with their reliance on broad standard industrial classification comparator categorizations.

difficulties in sustaining long-term performance arise not just from the competitive environment but also from problems in measuring the multidimensional character of performance

In this article we propose *frontier analysis* as a better method to address these three challenges. This method involves *the creation of frontiers of financial performance based on multiple measures over an extended period of time within a set of industry peers*. The general theoretical logic for this approach is based on the notion that superior performance arises from dominance.⁶ Dominance, as defined here, implies that a superior financial performer is one whose pattern of performance, on all or some combination of performance dimensions, is greater than its peers (we refine later what ‘all or some’ implies). This improved way of measuring relative company performance should be of interest not only to managers, but also to all those interested in the performance of companies - investment analysts, board directors, policy makers and academics.

We demonstrate this approach by applying the frontier analysis technique to two common types of performance rankings: single year performance within an industry (oil) and multi-year performance within a country (the UK). For the latter, we apply the technique to 215 of the largest

Exhibit 1

The Three Challenges and GE's Transition

The difficulty in understanding and characterising performance can be seen in examining the case of GE, one of the true sustained performers, and comparing its performance across the CEO transition from Jack Welch to Jeffrey Immelt. Welch's tenure as the CEO was something of a dream run - from 1981 to 1999 GE's share price increased three-fold - making him one of the iconic executives of the 20th Century. Immelt's tenure has been viewed less rosily, with the investors treating GE much less kindly under him than they did under his predecessor, despite the fact that what Immelt was managing was what he inherited from Welch, and that he had to do it in the considerably more difficult environment that followed the events of September 11, 2001.

GE's numbers and strategy create a complex picture. During his first 5 years as CEO, Immelt engaged in \$30 billion in divestitures and \$65 billion in acquisitions, dramatically altering GE's \$150 billion business portfolio and sectoral context, and hence the economic factors affecting company performance. During this period GE's performance on market measures (specifically, on share price) declined by over 30 percent, yet (with the exception of 2003 and 2004), the company's ROA results were above Welch's prior decade average, revealing that, in general, Immelt's strategy improved year-to-year GE's operational performance. What is clear is that this fact has not been incorporated into investors' beliefs about the future, because Immelt's strategy of focussing on innovation requires cash, and the level of dividends being paid out has been reduced in anticipation of future growth opportunities. Immelt's difficulties are with investors' concerns about two measures of performance - the share price and short term dividend flows. As Useem notes, *'According to an analysis by Stern Stewart, 82% of [GE's stock] price is based on investors' hopes for future earnings growth, rather than on GE's fundamentals [emphases added].'* It is also interesting to note that the slight decline in accounting performance seen in the early Immelt years is consistent with the general trend in GE's performance in the previous decade (which was for slightly lower returns in the 1990s than in the 1980s) and the general decline in diversified manufacturers' performances overall.

This short story reveals that, even for such an obviously iconic performer as GE, the three challenges rear their head. Has GE remained a sustained performer? Is 5 years too soon to make a judgement on Immelt's GE when the data conflict? To what extent can market analysts' 'future expectations' measure 'performance' when we have historic measures that do not line up with these expectations? What should be the basis of comparison when one-third of the company's asset base is altered?⁷

publicly listed UK companies and over 3,000 peer comparator firms, operating in nearly all industries with a significant UK presence, over the 20-year period 1984–2003. We find and identify 28 companies - both expected and unexpected - that meet our criteria for long term superior performance. We discuss the theoretical and practical issues in the measurement of performance, the logic and structure of frontier analysis, and how we go about structuring performance frontiers. We then apply the technique along with a set of normative criteria to determine a set of superior long-term financial performers. The application is meant to be illustrative, but also informative about what it means to be a superior performing firm. We end with some speculation about the implications of both the analysis and the technique.

Problems in measuring performance

Many measurement approaches suffer from the problem of providing a one-dimensional, short-term view of performance that is overly dependent on the measurement's start and end points.

While such a view is a poor predictor of future performance - as was found most glaringly in the case of Peter and Waterman's book, *In Search of Excellence* - it is (as Phil Rosenzweig has so elegantly pointed out) a hallmark of most attempts to attribute performance to specific actions and rules. Representing the one-dimensional view, some business researchers, especially those in finance, but increasingly also in strategic management, claim that Total Return to Shareholders (TRS) is the most superior and credible criterion for performance. Yet despite the obvious importance of TRS to investors, particularly in Anglo-Saxon (as opposed to Continental European or Japanese) business systems, there is little evidence that senior managers use it as the single measure of their firm's performance.⁸

shareholder return can be a treacherous indicator of a company's prospects

Although TRS has the benefit of being a robust backward and forward looking measure of financial performance it is not an ultimate measure without limitations. First, there are many intermediate outcomes that affect TRS - e.g., the level and growth rates of profits and return on investment, cash flows and many other non-financial variables such as market power and corporate reputation - and TRS represents only a collective opinion about their value.⁹ Second, the longer the time frame - and top managers have a much longer tenure than the typical holding period of most shareholders, certainly in the U.K. and the U.S. - the greater the influence of these intermediate outcomes on TRS. For example, one explanation for the lower TRS associated with Jeffrey Immelt's tenure at GE was his promotion of innovation (e.g., the 'Ecomagination' initiative) over labour and production productivity (e.g., Welch's six-sigma campaign). As the returns to innovation are less certain and longer term, and potentially require more upfront investment, they are subject to more varied interpretation by investors. Third, shareholder return can be a treacherous indicator of a company's prospects, as evidenced by the Internet-induced stock market bubble at the end of the 20th Century. The TRS of many of these companies was based on expectations derived from highly uncertain information such as 'click streams' and 'share of eyeballs', none of which proved to be particularly predictive of the actual financial outcomes. In our GE example, despite improved operational performance under Immelt, the company's price-earnings ratio was only half of that under Welch. Faced with such evidence, even TRS devotees are now questioning the primacy of shareholder value.¹⁰ Fourth, measures of corporate performance should be closely linked to what top managers can influence. Although the Chairman of the Board and the Chief Executive may feel they need to influence TRS, lower level executives need to manage to more specific operational performance measures that are influenced directly by their decisions. Mixed performance measures, such as economic value added, attempt to include the cost of capital in lower level operational performance metrics.

measures of corporate performance should be closely linked to what top managers can influence

Different companies and their top managers have different objectives, both from other firms and over different periods. For example, a younger, growing company may choose to place much more emphasis on revenue or market share growth than on profits (as Japanese automobile manufacturers did when first entering the United States in the 1970s and 1980s). At GE, for example, Byrnes has noted that Welch operated in a regime where cutting headcounts and improving cost performance was easier and more relevant and pensions funds were flush with cash, while Immelt, with much less latitude to reduce costs, has promoted an innovation based strategy instead. Depending

on their personal situations, equity holdings and performance incentives, some managers may emphasise TRS more than others. We know that top managers will tend to seek to retain the autonomy to run their companies as they think best, and therefore try to avoid pressure from stakeholders, particularly shareholders: to do so, they may only need to perform well on a few key financial measures. Thus managers of companies that do well on TRS will stress that measure, saying ‘never mind the profits for now,’ (the mantra for the many Internet start-ups of the early 2000s), while managers of companies with stodgy share price performance will invariably point (if possible) to profit performance. It is those managers whose companies perform badly on both TRS and profit-related measures who get into trouble.

*....comparing companies in the same industry in performance terms
....is vital to inform investors and evaluate and motivate managers.*

The frontier approach to measuring performance

We have argued above that different companies, especially in different industries, but even in the same industry, can justifiably use different measures of performance at different times. This might imply that even companies in the same industry cannot be compared or ranked in performance terms. But such comparison is vital, both to inform investors and to evaluate and motivate managers. Frontier analysis allows such comparisons (see [Exhibit 2](#) for a brief history of the method),

Exhibit 2

A Short History of Frontier Analysis

Frontier analysis was developed in the 1970s as a means of understanding the efficiency of decision making units (DMUs), which might be production lines, factors, firms or any closed system with specific inputs and outputs.¹² In its simplest form, known as Data Envelopment Analysis (DEA), non-parametric linear programming techniques are applied to estimate an input-output function where there is no need to specify the functional form *a priori*.¹³ The efficiency of a DMU can then be determined by comparing the difference between the *maximum* output(s) achievable with a set of input(s) to the *actual* output(s) achieved (or conversely, the *minimum* vs. the *actual* input(s) necessary to achieve specific output(s)). It is this benchmark comparison logic that has made DEA useful in a practical sense - by focusing not on absolute measures of performance but comparisons with benchmarks, it fits well with many of the conventional heuristics used by managers.¹⁴

DEA has evolved dramatically in terms of sophistication and application over the last 30+ years, and has been used to examine thousands of examples of input-output efficiency from private versus public universities to the financing of diagnostic related groups in health care and plant energy utilisation.¹⁵ It has proved particularly useful in examining the ‘performance’ of organisations that have no direct profit imperative, such as hospitals, and those with multiple inputs and multiple outputs. Its particularly relevance here lies in its ability to characterise situations with multiple outputs.

The method is not without its limitations, including its reliance on the veracity of the data at hand which (unlike in parametric approaches) are assumed to be correct, both in terms of objectivity and of freedom from error (although errors can be adjusted with some assumptions). This is particularly salient in the case of financial data which, even when audited, can be subject to error, interpretation and restatement.

and does so in a way consistent with strategic notions of sustained advantage (see Methodology Appendix for a technical description). The following presents a conceptual overview of a performance frontier and discuss how it can be operationalised to make effective and meaningful comparisons of firms within an industry.¹¹ We then illustrate the application of the same approach to identifying long-term sustained performers amongst a set of publicly listed UK companies across different industries.

What a performance frontier looks like

We can illustrate frontier analysis diagrammatically with the simple case of two measures of performance, although the technique can be applied for many measures. Figure 1 shows a hypothetical industry performance frontier for one year, using two dimensions of performance: X1 and X2. In this example, Companies A, B and C are all at the performance frontier for their industry that year, *even though each company has achieved a different combination of performances on the two measures*. Company A scores highest on X1, and Company C on X2. Company B does not score highest on either measure, but neither is it dominated overall by either A or C. Because we cannot say (without evidence) that any of these three clearly dominate the others on all of the performance dimensions being considered (or on a linear combination of those measures) – and nor can we conclude that any one of them has performed *less* well than any other firm - we state that, *together*, they define the frontier.

In contrast, companies E and F have each performed below that year's frontier for the industry, meaning that they are dominated either directly or indirectly by the firms with which they are being compared. In the case of F, its underperformance is simply the distance on the line between the points occupied by F and B, implying that it is using the same performance measures in the same proportions but is doing less well on both. In the case of company E, its underperformance is measured by the distance between its position and a point d, which is a combination of the positions of A and B. As there is no one company that has the same ratio as company E on the two measures, company E can be characterised as being dominated by a linear combination of these two competitors.

The benefit of this logic should be clear. First, one can begin to address the multi-dimensionality of performance without reliance on simple averaging (which will tend to mask differences and hide dominance). Second, where dominance exists, superior performance can be identified quite easily. Third, where dominance does *not* exist one cannot, empirically, make an a priori argument for superior performance. Any attempt to argue for the superior performance of one firm over another becomes wholly reliant on the (perhaps biased) opinion or orientation of the researcher, who must make an arbitrary or theoretical argument for a specific weighting of the various measures of performance. Hence, in the Figure 1 example, the conclusions that can be drawn are that {A, B, C} are superior firms relative to firms {E, F}. We cannot say anything about the order of performance of the three firms {A, B, C} or of the two firms {E, F}. All we know - and can say with confidence - is that {A, B, C} > {E, F}.

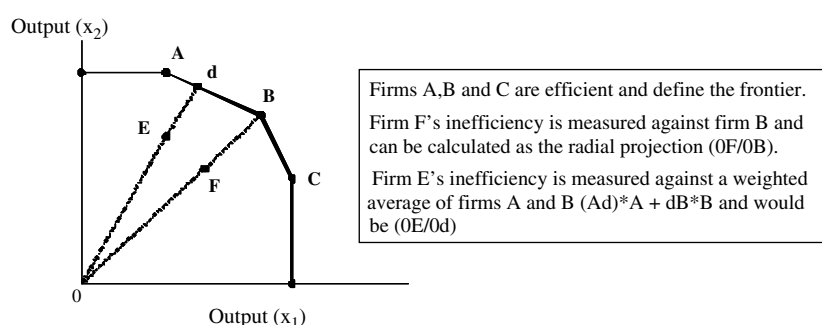


Figure 1. A Frontier with Two Dimensions of Performance

Choosing measures of performance

The performance frontier can be constructed from many different performance measures — but which should they be? Ideally, they should be a mix that reflects the interests of different corporate stakeholders but are also relevant to the operational and strategic decisions being made by managers. Different stakeholders expect different outcomes from companies and, hence, apply different measures. For example, in the U.K. and U.S., the majority of equity in large public companies is now owned by institutional investors who hold shares for a relatively short period of time (less than one year on average in the U.S.). While these investors place heavy emphasis on the direct outcome of TRS, they also care about intermediate outcomes — such as profits, innovation and reputation — in so far as they affect TRS and serve to signal future performance. Investors such as banks and insurance companies may regard cash flow and long-term survival as more important than TRS,¹⁶ while (as Dore notes) companies from Continental Europe and Japan also pay significant attention to the interests of other stakeholders. (These may include employees, who will care a lot more about jobs - quantity, quality and remuneration - as a direct outcome, and see TRS and profits, etc., as intermediate outcomes that affect jobs).

Top managers are the stakeholder group with the most power over a company's direction and success

Top managers are also key stakeholders and, even more important, are the stakeholder group with the most power over the direction and success of a company: 'C-suite executives' (CEO, COO, CFO, etc.) certainly have an interest in TRS, both as shareholders themselves and because of the pressure they face from equity investors. But TRS and other measures of returns on equity tend to be blunt instruments for monitoring and managing a company's myriad activities. For such purposes both top and middle managers rely much more on accounting measures - including profit margins, return on assets, and return on capital employed - that can get at the fine grain of a company's performance. As argued above, some stakeholders may even be concerned with non-financial aspects of performance, such as those relating to employees' employment conditions or social responsibility outputs.

The beauty of the frontier approach is that it can accommodate any mixture of measures and still allow companies to be ranked against each other, even where they excel on different criteria: in this sense, frontier analysis can compare apples with oranges! (Pursuing that analogy, frontier analysis can rank an apple as being closer to apple perfection than an orange is to orange perfection — dog show judges do the same when they select a 'best in show' from among different 'best in breeds'. But frontier analysis avoids the judgemental subjectivity often inherent in such decisions.)

With frontier analysis it is not so much the exact measures selected that is vital, but that there should be a broad and diverse collection of measures, all of which are related to underlying issue(s) of interest. Indeed, the more similar the measures are, the less information is revealed by the addition of another performance dimension, since the ordering of firms will not change. What this implies is that the choice of the measures used should be determined by: (1) are they relevant to important stakeholder groups (ones to which managers react)? (2) do managers manage to these measures or drivers of these measures? (3) are they duplicated by a linear combination of the other measures being used? In other words, these three criteria ask two variants of a *relevance* question and one *degree-of-independence* question.

Sensitivity analysis allows the investigator not only to examine the diversity of the measures needed, but also to see whether or not different weightings or groupings matter to the form or substance of the frontier. Indeed, with many other approaches - single item measures such as return on assets or TRS, or averages of combinations of measures - problems arise in that results will depend on the single measure chosen, or that the aggregation process smoothes over important effects.

With frontier analysis, adding more measures provides more information and, hence, can allow the investigator to differentiate exactly where a single firm is clearly dominating - or being dominated by - its peers. We also believe it is just as important to know when there is no dominant, superior performance as it is to know when such performers exist: thus, an additional value of frontier analysis is in revealing when conclusions about relative performance *cannot* be made.

For the purpose of studying long-term financial performance, we have adopted a selection of financial measures meant to be representative of the sort of information investors, managers and key stakeholders would examine when gauging whether or not a firm is performing well. (The choice of these measures is discussed later.)

Choice of comparators

As Paul Nunes has noted, '*you can call anyone a winner depending on how you draw the set around them.*'¹⁷ As with any ranking approach, we must choose a relevant set of comparator firms, since being superior means being superior to something or someone else. Managers compare their performance to benchmarks, either to the stock market as a whole (e.g., all FTSE 350 companies or the S&P 500) or, more commonly, to their peers in the same industry and to their own historic performance. However, almost every company of notable size (e.g., large enough for the FTSE 100 or the *Fortune* 500) operates with its own unique mix of participation in industries, countries and market segments, all of which have their own effects on company performance, and will thus influence performance expectations. If two companies in the same industry have a different mix of international business locations one could expect them to perform differently in ways related to the prospects of the countries where they operate, so few companies have directly comparable peers against which to benchmark performance (and, indeed, managers are very cognizant of this fact). While comparisons should ideally be made with peers that are as similar as possible, allowance needs to be made for different yardsticks for different companies. As noted above, frontier analysis allows for this kind of diversity in its ability to accommodate firms choosing different performance metrics on which to concentrate: all that is asked is that firms perform best *on that combination*.

in an increasingly globalised world, where more and more competition is cross-border, comparisons should be with both domestic and international industry peers

As we have to select some set of comparators, we believe that industry peers are the most relevant, as industry is the most influential group identity affecting performance, as opposed to others (nationality, size, nature of ownership etc.): certainly, industry effects account for a significant percentage of variance in firm performance. And, in an increasingly globalised world, where more and more competition is cross-border, we believe that comparisons should be with both domestic and international peers in the same industry.¹⁸

Controlling for industry effects

This discussion also has implications with respect to industry effects. As noted above, it is well established in the strategy literature that industry effects on performance are strong, so our approach here must control for industry differences. This is done, first, by controlling the peers that determine the industry set, and second, by adopting an industry-by-industry approach (or more correctly, a peer-set by peer-set basis) to conducting the analysis, since the frontier cannot be, either theoretically or empirically, estimated outside the set of firms that form the industry peer set. In other words, the greater the differences between the firms being compared the less meaningful the frontier becomes.

The importance of this can be seen in the examples illustrated in [Figure 2](#), which presents the average efficiencies of firms in each of 44 industries. This efficiency (represented in [Figure 1](#) by

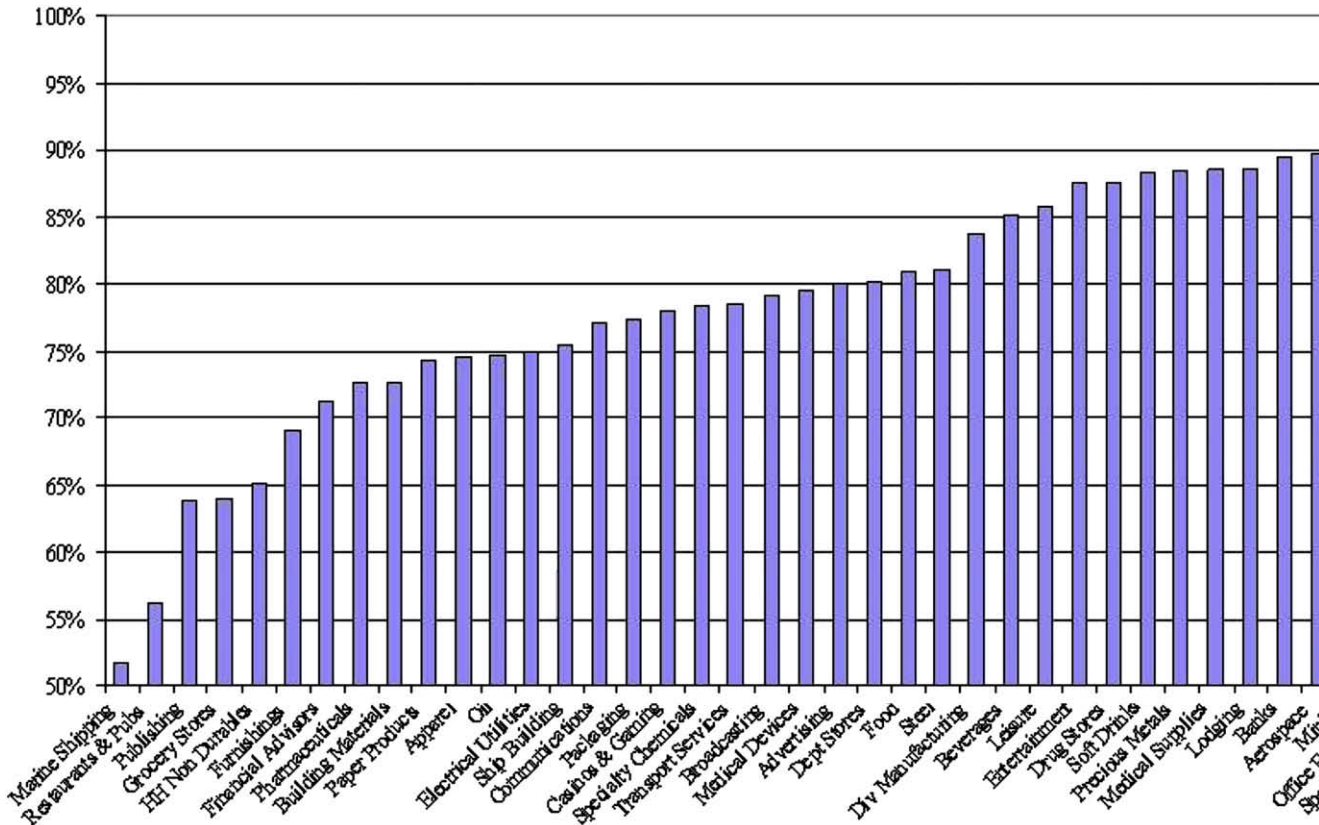


Figure 2. Average Firm Performance (Efficiency) Relative to Industry Frontier
Note: industry data are based on all firms in the top 50 or 100 of each industry, mostly for the period 1984 to 2003

the distances Ed and FB) is measured against that of the industry frontier firms, which are given an efficiency level of 100%. In other words, the bars in the Figure 2 chart represent how close the efficiency of the average firm in each industry is to its industry frontier in percentage terms - the higher the number the closer it is to the best performance frontier.

If we examine the airline industry, we see that, over twenty years, the average firm exhibits an average efficiency of 96%, very close to the frontier: what does this imply and what does it *not* imply? First, it does *not* imply that airlines are more profitable in an absolute sense than marine shipping companies (where the average performance efficiency is only 52%), since the performance efficiency is not a between-industry comparison and airlines are not relevant as peer comparators to marine shipping companies. Hence, nothing can be said about the *absolute* value of financial performance across these industries from this analysis. Whether the airline *industry* should be considered to be a poor investment is not determinable from these numbers alone: the industry has many unfavourable characteristics, making it 'unattractive' by standard strategic definitions,¹⁹ but these only determine the *level of the frontier*, not the *relative position* of firms on or below that frontier. (That would be akin to comparing a 100-meter sprinter's average time per kilometre to that of a marathon runner.) Second, what it *does* imply is that there are very few fundamental financial performance differences *between firms in the airline industry* but *potentially many differences between marine shipping firms*. This may arise from any of a host of reasons: heavy competition, standardization, regulation, consumer or technological homogeneity, capital utilisation, and so on. For example, the role of standardisation does seem to explain some of the patterns between industries. If we compare the number of different Standard Industrial Classification (SIC) codes represented within each industry segment illustrated in Figure 2, we find a correlation of -0.31 , implying that industries made up of *more* SIC codes (i.e., those are *less* standardized/*more* diversified) have *lower* average efficiencies. The implication of this lower average efficiency is that the broader, more heterogeneous the industry definition, the greater is the margin for sustainable performance differences within it.

Selection of time period

What is the relevant time period for measuring sustainable superior performance? Most researchers use three to five years, but we believe that the answer should relate to the length of endurance of the factors that underlie performance. There are now many schools of thought on what drives superior performance. Among strategists, the two dominant paradigms of competitive positioning and superior resources both emphasize the long-lived nature - often ten or more years - of these bases of superior performance.²¹ Indeed, a recent empirical study by Morgan Stanley estimated that, depending on the industry, a well financed and aggressive competitor would require between two and 23 years to establish a business similar to that of leading industry incumbents.²² Companies must see off challenges from new competitors (or new ones from established competitors) which tend to occur episodically, and often less frequently than every three to five years. They also need to sustain performance through business cycles, so performance should be judged over at least one complete cycle, which can take ten years or more from peak to peak. Lastly, companies have to perform through significant environmental changes, which may occur less often than every decade. Hence, there is a case for examining performance periods that are multiples of decades, and a number of previous well-known studies on performance have used periods of between 10 and 20 years.²³ From the different evidence and arguments above, we selected 20 years as the relevant period for this study.

[Frontier analysis] plots annual deviations to show how far a company is from the frontier each year, establishing a picture of performance over an entire period



Figure 3. Examples of Annual Deviations from Frontier. A Qualifier and a Non-Qualifier as Long Term Superior Performers

One other problem of time period selection is sensitivity to start and end dates if the measure concerns total (or average) change from start point to end point. (We are all familiar with how company and fund managers select periods to maximise reported performance.) The frontier technique avoids this problem by taking an annual (or other period) approach such that performance can be viewed as a pattern over multiple years, and with each year's performance independent of previous ones. That is, the technique does not look at change from the previous year - it plots annual deviations to show how far a company is from the frontier each year, thereby establishing a picture of performance over the entire period (see example in [Figure 3](#)).

Applying the frontier technique

To demonstrate the approach here we conduct two sets of analyses. First, we use an analysis of selected companies in the oil industry in one year to show how frontier analysis can create a rank

order of performance across multiple measures. It also reveals the difficulty with averaging across measures and why a more robust approach is needed. Second, we use an analysis of 215 British companies over 20 years to show how the technique can indeed identify long-term superior performers.

Creating a rank order across multiple measures

For the performance ranking analysis we selected the oil industry because it is particularly problematic. It contains large companies from many different countries that might also be assumed to stress different measures. Table 1 shows the 2002 rankings of 11 major oil companies from various countries on seven different performance measures (see also Exhibit 3). What is revealed in the table is that it is *not at all clear* from considering the seven different measures which is the best overall performer, which the worst, and how the others rank in between. Statoil (Norwegian) has the most first place rankings and seems to be the best performer: Conoco Phillips (American) has the most last place rankings, and seems to be the worst. But are these judgements correct? In particular, which measure or measures should dominate? And what should be the criteria for deciding on weights? Or should they all be weighted equally? The frontier technique avoids the need to make decisions on weights, merely on what measures to include.²⁴ It is worth noting that the more measures that are included, the less important any single measure becomes (particularly if the measures entail, effectively, the same information) and also that measures that reveal no clear pattern of dominance are also less important as performance differentiators.²⁵

In this exercise we compared the 2002 performance of each firm on each measure with the performance of *all* major oil companies (not just these eleven) on the same measures *for all the years* from 1984 to 2003. What this effectively does is determine benchmarks as firm/year combinations. In other words, the approach is both backward and forward looking: firm performance is benchmarked against how well both it and other firms did, in both the past and the future.

We found that the best frontier was determined by three of the seven measures - return on total assets (ROTA), total shareholder return (TRS) and Tobin's q - and was defined by just four firm-year combinations - Lukoil in 1999, Royal Dutch Shell in 2001, PPT Public in 2002, and Sinopec in 1999: none of the other hundreds of combinations registered performance as good.²⁶ We then calculated the efficiency (closeness to the frontier as defined by the three measures of ROTA, TRS and Tobin's q) for each of the eleven companies in 2002, resulting in the overall ranking shown in Table 2. Now we can see that three companies share the first ranking: Statoil, Imperial Oil

Table 1. Performance Rankings of Selected Oil Companies on Different Measures in 2002

Company and Nationality	Profit Margin	ROSF	ROTA	ROCE	CFOPR	TRS	Tobin's q
BP (UK)	9th	8th	7th	7th	10th	8th	3rd
Chevron Texaco (USA)	10th	10th	10th	10th	9th	5th	9th
China Petroleum (CHN)	8th	9th	8th	8th	3rd	1st	11th
Conoco Phillips (USA)	11th	11th	11th	11th	11th	4th	10th
ENI (ITA)	2nd	3rd	4th	3rd	4th	9th	4th
Exxon Mobil (USA)	6th	4th	5th	6th	8th	11th	6th
Imperial Oil (CAN)	4th	2nd	3rd	4th	7th	2nd	1st
Royal Dutch Shell (NL)	5th	7th	2nd	5th	1st	10th	2nd
Repsol YPF (ESP)	7th	5th	6th	2nd	6th	6th	8th
Statoil (NOR)	1st	1st	1st	1st	5th	3rd	5th
Unocal (USA)	3rd	6th	9th	9th	2nd	7th	7th

Note: rankings are among these 11 companies only, not among all oil companies. Profit Margin = Net Profit as Percentage of Revenues. ROSF = Return on Shareholders Funds. ROTA = Return on Total Assets. ROCE = Return on Capital Employed. CFOPR = Cash Flow from Operations. TRS = Total Return to Shareholders. Tobin's q = ratio of the market value of firm assets to their replacement cost.

and Royal Dutch Shell, while Conoco Phillips remains last. Without this frontier analysis, we might have ranked Imperial Oil somewhat lower and Royal Dutch Shell much lower, as both ranked relatively low on several measures, but not (for the most part) on the three frontier-defining measures. Similarly, although Conoco Phillips did well (4th) on the TRS measure, adding the other two frontier defining measures dropped it to last place.

What this example reveals is the value of using a more systematic approach to thinking about superior performance, and how the assumptions underlying the frontier approach can lead to a more parsimonious way of thinking about how performance rankings are formed. It also reveals the limit of the performance information that we have available and how it is used. For example, the orderings we create indicate not only where performance dominance exists, but also where it does *not*, which is important in a world where performance league tables seek to make minute differences more significant. Our analysis thus implies a cautionary perspective: when dominance does not exist it is much harder (indeed perhaps impossible) to draw meaningful conclusions about performance differences between sets of companies.

Similarly, we are limited by the veracity of the data available. For example, in 2004 Royal Dutch Shell revealed that it had overstated its reserves by 20%.²⁷ Of the numbers examined by us as ‘performance’ indicators, only TRS would have been influenced by that knowledge (as indeed it was, by more than 7%). Had reserves been in our performance measures, Shell’s restatement would have meant the company’s overall performance had been erroneously inflated.

Examining performance over multiple years

The previous analysis demonstrates how the frontier analysis technique can be used for one common performance analysis task - ranking in one year within an industry. Next we demonstrate how the technique can be used for another common challenge — identifying a country’s best long term performers.

Selection of industries and companies

We selected those 38 industry sectors in the Osiris database (see [Exhibit 3](#)) that had significant numbers of large UK companies, and for which complete and consistent data were available ([Table 3](#) indicates which sectors we were able to analyse, and which not). We defined ‘large’ by the firm’s ranking by asset size in the world’s top 100 within its particular Dow Jones Classification Industry (in the few cases where there were less than 100 firms in a specific industry in the database we used the top 50 as the frontier). The two criteria of significant presence of UK companies and complete data meant that we excluded 43 industries, nearly all of which have few British companies

Table 2. Performance Efficiency and Ranking of Selected Oil Companies in 2002

Company and Nationality	Efficiency	Rank Order
Statoil (NOR)	100%	1st=
Imperial Oil (CAN)	99%	1st=
Royal Dutch Shell (NL)	99%	1st=
ENI (ITA)	98%	4th
BP (UK)	97%	5th=
China Petroleum (CHN)	97%	5th=
Repsol YPF (ESP)	97%	5th=
Unocal (USA)	97%	5th=
Chevron Texaco (USA)	95%	9th=
Exxon Mobil (USA)	95%	9th=
Conoco Phillips (USA)	93%	11th

Efficiency = performance relative to the frontier for 1984 to 2003. The frontier is defined as 100% efficiency.

in the global top 50/100. The only notable exceptions were pharmaceuticals and various financial service industries, where large number of mergers and acquisitions over the 20 year time period caused severe data problems. (Various aggregations accounted for the 8 industries neither included nor excluded from the total number of 89 on the Osiris database.) Following from our earlier argument, prior work indicated to us that the DJIC offered more stable and more realistic

Table 3. Industries Analysed and Not Analysed

Industries Analysed	Industries Not Analysed
Advertising/Market Research	Advanced Industrial Equipment
Aerospace	Agriculture
Airlines	Aluminium
Apparel	Auto Parts
Broadcasting	Automobile
Building Materials	Banks, Ex-S&L
Casinos & Gaming	Biotechnology
Chemicals, Specialty	Chemicals, Commodity
Communications	Clothing & Fabrics
Department Stores	Computers
Diversified Manufacturing	Consumer Electronics
Distillers & Brewers	Consumer Services
Drug Stores	Cosmetics
Entertainment	Diversified Financial
Food	Diversified Technology
Furnishings & Applications	Electric Components
Grocery Stores	Factory Equipment
Heavy Construction	Financial Advisors
Household Non-Durables	Fixed-Line Communications
Leisure	Footwear
Lodging	Forest Products
Medical Devices	Healthcare Providers
Medical Supplies	Heavy Machinery
Mining	Home Construction
Office Equipment	Household Products, Durable
Oil	Industrial Services
Paper Products	Insurance, Full Line
Precious Metals	Insurance, Life
Publishing	Insurance, Property
Restaurants & Pubs	Internet Services
Retailers, Specialty	Investment Services
Ship Building	Nonferrous Metals
Shipping	Oil Drilling, Equipment
Soft Drinks	Pharmaceuticals
Steel	Pipelines
Telecoms	Pollution Control
Transport Services	Real Estate
Utilities	Savings & Loans
	Semiconductors
	Software
	Tires
	Tobacco
	Toys

classifications, given that some large publicly traded companies spanned as many as 50 4-digit SIC codes, and that the DJIC system was actively used by both firms and analysts. (We tested the validity of our choice by conducting analyses using 3 digit SIC codes, but found the frontiers derived from them were much less stable and significantly less likely to produce interpretable results.)

Selection of time period

Following our earlier arguments for a 20-year period, we selected the time span of 1984 through 2003, mainly because the last year was the most current one in the database. This period is also particularly relevant for British companies, in that it starts around the time the Thatcher reforms began to affect the economy and the environment facing UK companies, as well as spanning at least one economic cycle - the boom and bust of the Internet bubble, as well as the stock market melt-down of 1987 - providing an extra test for sustained performance.

Selection of measures

For reasons of data availability we selected five measures: profit margin (%), return on shareholders' funds (%), return on total assets (%), return on capital employed (%), and cash flow to operating revenues (%). As demonstrated in the analysis of oil companies, where only three measures defined the frontier, the results from frontier analysis becomes less sensitive as more measures are added. Hence, we conclude that these five measures would give an adequate picture of a firm's performance position without unnecessary duplication. We checked our results against alternate sets of measures, some of which included measures of return to shareholders (TRS and Tobin's q), but while these alternative sets produced additional qualifying companies, they always included those that qualified under the five measures reported here. Hence, any error from choice of measures would have been of exclusion but not of inclusion. We chose the five measures because we wanted to be confident that the companies we labeled as long-term superior performers did indeed qualify under alternative sets of measures, but also to ensure that we had the largest possible data sample (for instance, including Tobin's q led to approximately 10% missing data).

only 28 out of 215 firms — a mere 13% of all UK firms — stayed close to the frontier consistently over our twenty-year period

Exhibit 3 Data Base

For all the analyses in our study, we used the Osiris database (provided by Bureau van Dijk) which contains annual report data on 30,000 public companies (and 8,000 unlisted and delisted companies) covering more than 125 countries from around the globe over the past 20 years.

The standard problem in analysing companies relative to industries is that traditional industry classification systems, especially the Standard Industrial Classification, provide a poor match with the activities of diversified companies, having been designed with industries, not companies, in mind. Osiris uses the Dow Jones Global Segmentation Industry Classification (DJIC) scheme of 89 defined industries. This system assigns one dominant industry to each company (public companies only), and has the advantage of having been designed to achieve the best fit for the world's existing companies and be most relevant to investors and analysts. While the problems of classifying diversified companies can never be completely eliminated, the Dow Jones classifications in fact work remarkably well for capturing the actual diversified patterns of most companies with the lowest level of error.²⁰

Selection of performance criteria

For a company to qualify as a long-term superior performer we used criteria that accounted for both the firm's *relative position* and its *consistency of performance*. The operative criteria were how close to the performance frontier a company was year-by-year over the twenty-year period, and whether it stayed close to the frontier consistently over those years. In the end, we found that only 28 out of 215 firms — i.e., a mere 13% of all UK firms — were 'qualifiers' that fell into this set. The specific criteria used to determine whether or not a firm qualified as a superior long-term performer, in order of stringency, were:

1. The firm had to have been in existence for 20 years. This criteria ensured we had long-term performers;
2. The firm had to have been in the top one-third of the performance distribution in its industry peer set during the 20-year period. In other words, when compared to its industry frontier, it had to be in the top one-third of performers on average over this period. This represents the *relative performance* criterion — the average deviations from the frontier are represented in the data given earlier in [Figure 2](#).
3. The firm could not have recorded more than two years of consecutive performance decline, in only one of which could it have fallen out of the top third of performers in its industry. In other words, a firm that, on average, had been in the top one-third over the 20-year period could register two years of declining performance, including one year out of the top third of performers — a longer (or deeper) decline would have disqualified the firm based on the *consistency of performance* criterion.

While other researchers, analysts or managers might choose other specific criteria, those we used were specifically aimed at addressing the issues of: (1) performance relative to peer comparators and (2) consistency of performance over time. It is important to recognise that more or less stringent criteria would not change the order of firms or limit the reliability of the technique - it would just change the definition of what it means to be in the set of superior long-term performers.

Annual deviation from the frontier

Once the performance frontier was created for a particular industry, each company's 'deviation' for each year (their distance from the frontier) was calculated. As we determined the performance frontier for 20 years, we were able to plot each company's performance relative to the frontier over time: this approach is illustrated in [Figure 3](#) for two companies. The first — the aerospace company Cobham — easily qualified on the three criteria, as is illustrated by the bar chart of their deviation from the frontier, which shows that, in every year, Cobham was above the 90th percentile of performance relative to the frontier. By contrast, the second company — the publishers Reuters - shows the power of observing annual deviations. While Reuters performed very well for the 15 years from 1985 to 1999 (and was even the frontier performer with a value of 100% in 1999) it then went into rapid decline, and fell below 40% in 2003, thus clearly failing both criteria 2 and 3. The Reuters example shows how examining the annual deviation from the frontier reduces the sensitivity to start and end dates for measures of performance over a time period. Reuters was indeed a superior performer until its change of strategy in 2001 to diversify into Internet-related businesses. (Similarly, Vodafone would probably also have been at risk of dropping off the list if the analysis were extended into 2006).

The qualifying UK industries and companies

Using our selected measures and criteria, our analysis of the 215 UK companies in the 38 industries identified 28 companies in 19 industries as qualifying as long term superior performers ([Table 4](#)). Some of these qualifiers — such as BP, Cadbury-Schweppes and Tesco — could probably have been named by most casual observers before our analysis, while others, such as AG Barr and Bepak, are much less well known. And some well-known companies, such as Unilever and Whitbread, might well not have

featured on most lists of best performers, even though our analysis shows that they should. As with all rankings of performance, we have to stress that the ranking applies only for the time period studied, and is not necessarily a predictor of future performance. Apart from anything else, any company with a long period of sustained superior performance must be in danger of developing obsolescence in its business models and strategies, as well as increasing competitive envy, imitation or challenge.

In examining Table 4 it should be noted that the distance between the average performance efficiency level and the frontier performers may seem quite small. But it should be remembered that there are three criteria and it is consistency (criterion 3) that is the final determinant. Many firms have outstanding years, but few can remain outstanding with any regularity. That said, it is also telling (and consistent with notions of erosion of performance) that few UK companies are constantly at the very edge of the frontier, with the possible exceptions of Balfour, Huntleigh Technology, the aerospace firms (Cobham, Meggitt and Smiths), and Shell (bearing in mind its wrongly stated profits), each of which was a frontier firm in one or several years. Vodafone also defined the telecommunications frontier in its early years, but has remained a frontier performer not because of outstanding absolute performance but because its performance has declined less steeply than that of the industry as a whole.

It is not the purpose of this article to explain in depth why each company qualified — in fact the reasons tend to be very different in each case. Nevertheless, we can discern three broad categories that

Table 4. UK Companies Qualifying as Long Term Superior Performers (1984 to 2003)

Industry (Average Performance Efficiency, Firm by Year)	Companies	Firm Average Performance Efficiency
Advertising (80%)	Taylor Nelson Sofres	85%
Aerospace (89%)	Cobham	94%
	Meggitt	93%
	Smiths Group	95%
	Allied Domecq	88%
Alcoholic Beverages (85%)	Scottish & Newcastle	88%
	Next	80%
Apparel (74%)	Hilton Group	80%
Casinos & Gaming (76%)	Stanley Leisure	80%
	Balfour	96%
Construction (92%)	Boots	92%
Drugstores (87%)	EMI Group	90%
Entertainment (87%)	Cadbury-Schweppes	87%
	Unilever	84%
	Tesco	68%
Grocery Stores (63%)	Reckitt Benckiser	70%
Household Non-Durables (65%)	Smith & Nephew	83%
Medical Devices (79%)	Bespak	92%
Medical Supplies (88%)	Huntleigh Technology	95%
	Domino Printing	92%
Office Equipment (90%)	BG Group	77%
Oil (75%)	BP	78%
	Shell	99%
	Bunzl	86%
Paper Products (74%)	Greene King	58%
Restaurants & Pubs (56%)	Whitbread	58%
	AG Barr	90%
Soft Drinks (88%)	Vodafone	95%
Telecom (92%)		

provide a glimpse at some of the strategic orientation and market circumstances of superior performing companies that we label ‘large survivors,’ ‘protected nichers’ and ‘successful challengers’ (see Table 5).

The ‘large survivors’ (typified by Shell, Unilever, Balfour and Reckitt Benckiser) were already large, successful and well-established at the start of the 20-year period.²⁸ Many operated in competitive, but not punitive, environments, while some (such as the aerospace companies Cobham, Meggitt and Smiths Group, with their links to the defence establishment) operated in semi-protected environments. These companies had starting positions where size and market dominance, combined with some evolutionary changes in strategy, helped them to sustain their long-term superior performance.

The ‘protected nichers’ are typified by AG Barr (a Scottish company making specialised beverages such as ‘Irnbu’) and Bepak (a producer of drug delivery and similar medical devices). These companies typically remained in their niches, excelling within them, but were less exposed to direct competition.

The ‘successful challengers’ - perhaps the most interesting group — are typified by BP, Cadbury-Schweppes, Smith & Nephew, Next and Tesco. Most of these companies started out as medium-sized companies facing much larger, formidable competitors, but over the twenty-year period transformed not only their mix of businesses, but also their business and management models.

It is not the identity of the companies that matters, nor have we produced a list of all long-term superior performing British companies over the period 1984 to 2003. What matters is that the frontier technique can produce a list of winners (or losers or any other ranking) from a diverse group while avoiding the common problems of recency effects (where observers remember only recent performance), insufficient number of measures, and inappropriate comparators.

Table 5. UK Long Term Superior Performers by Categorization

Industry Sector	Large Survivors	Protected Nichers	Successful Challengers
Advertising		Taylor Nelson Sofres	
Aerospace	Cobham Meggitt Smiths Group		
Alcoholic Beverages	Allied Domecq	Scottish & Newcastle	
Apparel			Next
Casinos & Gaming	Hilton Group	Stanley Leisure	
Construction	Balfour		
Drugstores	Boots		
Entertainment	EMI Group		
Food	Unilever		Cadbury-Schweppes
Grocery Stores			Tesco
Household Non-Durables	Reckitt Benckiser		
Medical Devices			Smith & Nephew
Medical Supplies		Bepak	Huntleigh Technology
Office Equipment			Domino Printing
Oil	BG Group Shell		BP
Paper Products	Bunzl		
Restaurants & Pubs		Greene King	Whitbread
Soft Drinks		AG Barr	
Telecom			Vodafone

Discussion

Prior research studies in strategy, particularly those related to the resource-based and dynamic capabilities theories, have emphasized firm specific advantage and sustainable performance. However, nearly all the empirical modelling of performance has utilised approaches based on central (average) tendencies. Our use of frontier based modelling is better aligned with both theory - in that we address the critical issues underlying what Kirby has called the 'quixotic quest' for a singular robust assessment of superior performance, and make maximal (not average) performance tendencies the focus of our attention - and also managerial practice - where companies look to improve performance by benchmarking extreme comparators (those on the frontier of performance). Here our approach should make it easier for managers to achieve sustained long-term superior performance by making it easier to meet the three critical challenges of performance measurement identified at the beginning of the article.

empirical modelling of performance is usually based on averages.

Frontier based modelling makes maximal performance the focus [just as] companies look to improve by benchmarking extreme comparators

For Challenge 1 — *Balancing Short-Term and Long-Term Performance*, frontier analysis allows the use of measures over any time period and the visual display of annual deviations (as illustrated by the Cobham and Reuters examples) makes it easier to identify different periods of superior or inferior performance. More important, frontier analysis allows a clear view of how performance tracks over time relative to a defined maximum set by selected peers. Such comparisons can, of course, also be done with simple benchmarking comparisons, but these suffer from the need to show either many individual measures or an arbitrarily formed composite, which itself involves the problem of how to construct the composite, and the need to force all companies to be measured against the same benchmark.

Frontier analysis is expressly designed to meet Challenge 2 — *The Conflicts between Different Measures of Performance*. Any number of measures can be used, with the additional benefit that the technique can reveal the smallest subset of measures that best defines performance in a particular industry. In particular, frontier analysis allows different firms to be compared even when they themselves are being managed to different criteria. Our oil company analysis illustrates how varying performance on eight different measures can be reconciled to produce a clear ranking of performance.

For Challenge 3 — *Finding the Right Comparators*, frontier analysis does not eliminate the problem of company diversity, but reduces its effect by allowing different companies to, in effect, select their own dimensions of performance. For example, in our analysis of UK companies, both Cadbury-Schweppes and Unilever qualified in the food category, even though they have quite different product mixes. For companies with sufficiently diverse businesses that they might need to be analysed in more than one industry, the exercise can be repeated placing the company in different sectors. If the answer comes out different - for example, if the same company shows up as a long-term superior performer when compared to its peers in one industry but not in another — that is a valuable result, which the company might use to consider rebalancing its portfolio of businesses towards those sectors where it qualifies as a long-term superior performer and away from those in which it does not.

By meeting these challenges, frontier analysis, applied in the context of strategic performance, can improve strategic management or investment analysis in a number of ways. As emphasized in this article, there is clear application to the comparison of performance at company level, allowing for different comparators and coping with the problem of corporate diversification. As argued above, this technique can be used as an adjunct to business portfolio analysis to evaluate whether a company is in the right mix of industries. Similar benefits — of coping with a diverse comparator group

and strategic situations — can apply in using the method to compare business units within a company: since frontier analysis allows each unit to excel on its performance dimensions, this technique can be particularly helpful in adjusting for the differing emphases of different units over time, particularly depending on their age and strategic objectives. One business unit might reach the frontier in terms of sales growth, another in terms of profits and yet a third in terms of the combination of the two — but at the same time others may be revealed to be below the frontier over many years and on many criteria. Thus the technique could also help in the perennial problem of deciding compensation for top managers in a multi-divisional company, when the divisions' value drivers may be quite different and call for differing performance measurements.

Investment analysts can conduct the same analyses, especially for comparison across rather than within companies (partly because that is their focus and also because they only have access to public data). Our comparison of average industry efficiencies (Figure 2) is also very valuable to analysts in their searches for companies that are likely to greatly outperform (or underperform) their industry peers. Our results show the relative prospects of all the industries we analysed, pointing to the airline industry (with the highest average efficiency from 1984 to 2003) as the worst in which to look for outperformers and the marine shipping industry as the best.

This logic also holds when looking beyond financial performance measures. Our analysis and examples here are limited by the use of purely financial measures of firm performance - and hence depend on the veracity of data drawn from firms' financial statements. But this does not mean the approach could not be expanded to include non-financial measures, such as exemplified by the 'triple bottom line'. Indeed, it is arguable that the non-parametric nature of DEA makes it particularly suited for broad comparisons between what are more independently determined performance characteristics. As analysts become more open to triple bottom line accounting, the use of an approach like ours will potentially allow them to make more clear and substantive comparisons between competitors. One can also speculate as to the value of the approach for examining the performance differences of multinational subsidiaries operating in different geographic markets. The logic is no different than that discussed in the business portfolio argument, except that performance differences can now be more readily related to the economic, political or cultural differences of different subsidiaries' operating locations.

*[frontier analysis] can be expanded to include non-financial measures.
As 'triple bottom line' accounting [gains ground], our approach will
potentially allow for more clear and substantive comparisons [across]
more independent performance characteristics*

In conclusion, our frontier approach implies that managers, analysts and researchers need to take a more complex conceptual view of what it means to have long-term superior performance and to think more deeply about how to measure that performance. However, at the same time it follows that simple benchmark comparisons can — as Gigerenzer et al. note - potentially provide managers and analysts with a powerful logical heuristic that can help them make quicker and better decisions. Although our approach is technical, the logic itself can be applied easily to small sets of firms (as shown in the oil industry example). Such an approximation is logically consistent with our approach and theoretically consistent with extant thinking in strategy.

Acknowledgements

We thank the Editor in Chief and the journal's anonymous reviewers for their encouragement and advice, as well as our colleagues in the Advanced Institute of Management Research for their many

comments and suggestions. We acknowledge funding assistance from the Economic and Social Research Council and the Engineering and Physical Sciences Research Council.

Appendix: Methodology

Normal approaches in strategy and management (and indeed industrial organization in general) rely on comparisons between mean cross-sections of firms (as would be the case with regression analysis or ANOVA). Population ecology studies rely on survivorship analyses that do not distinguish between levels of survivorship, while more qualitative assessments have often suffered from ex-post sampling problems (the most famous case being Peters and Waterman's *In Search of Excellence*).

Frontier analysis

Our approach is based on 'Frontier Analysis,' which has a long tradition in economics and operations research, particularly for estimating production functions and benchmarking activities. It is based on the simple logic that it is the extremes of the distribution in the data that are of interest — in the case of production, the minimum (rather than the mean) costs associated with a volume of output. In our case it is the maximum performance that is the focus. Two approaches are used. One — Data Envelopment Analysis (DEA) — is a linear programming approach that allows for assessment of multiple outputs and can handle small samples, but (as Charnes et. al note) suffers from the fact that it is non-parametric. The other, Stochastic Frontier Analysis (SFA), is a parametric approach that accounts for the stochastic character of the data, but requires larger sample sizes and can accommodate only one dependent variable.²⁹ For this study we chose to use DEA as a means of creating a sample of 'frontier' performers because it allows us to make use of multiple measures of performance and impose a more stringent set of criteria that requires firms to be extreme on more than one dimension of performance. This is critical in our case, as our reliance on DEA and secondary data means that we could make selection errors if we used a limited number of performance criteria. The output of interest to us is the *performance efficiency* of a firm, measured across multiple criteria and based on a comparison with a global industry peer set. Figure 1 shows how such a performance measure is calculated in a situation with 2 output measures (space precludes us from going into greater detail). The maximum efficiency measure is 1 and numbers below 1 can be roughly interpreted as percentage deviations from the frontier. Empirically, efficiency is measured as a radial projection from the origin to the nearest point on the frontier in the space defined by the dimensions of performance. Frontier analysis puts heavy requirements on the quality and comparability of data. Hence, we estimate the frontiers on an industry-by-industry basis using comparable measures of performance (excluding e.g. taxation, depreciation and other factors that would be distorted by different countries' accounting standards).

The logic for the use of DEA in management research is outlined in a number of papers and can be justified with recourse to resource based and capabilities thinking.³⁰ The resource based theory and dynamic capabilities approaches emphasise the unique, path dependent, causally ambiguous components of a firm's structure as major determinants of *long-term strategic* performance. However, tests in these theories traditionally rely on analyses that compare the *mean* performances of different cross-sections: by emphasizing *extreme* performances, DEA is more in line with the logic of current strategy theory.

Selection of firms

The logic is that a firm is being benchmarked not just against other firms' performance in a given year but against *any* firm's performance in *any* given year. Therefore, each combination of firm-year potentially represents a frontier performance against which other firm-years can be compared. This creates several complications for which adjustments needed to be made. First, all the performance measures must be computed in comparable terms (including adjusting for currency changes and inflation) and based on criteria specific to the industry. Second, where an industry shows changes

in average performance efficiency over time we need to adjust the distribution to account for such temporal patterns. For example, the telecoms industry showed no change in average efficiency until around 2000 when the average firm's efficiency declined. Figure 3 shows the example of Reuters in the publishing industry, which was excluded based on criteria 2 and 3: despite being a frontier performer in 1999 and having quite good performance at times (average performance efficiency in its industry is 65%), its performance was erratic and registered a significant collapse over the last four years of the study period.

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24. Frontier analysis has the added advantage of being flexible with respect to weighting. One could, if desired, weight the various measures according to some rule - in this analysis we assume that any measure is equally valid and what matters is the mixture of measures.
25. This is consistent with E. H. Feroz, S. Kim and S. L. Raab, Financial statement analysis: a data envelopment analysis approach, *Journal of the Operational Research Society* **54**, 48–58, (2003) They specifically note that DEA is particularly useful when different output measures are providing different pieces of information and interpretation is problematic.
26. The frontier with 3 measures was as good as others with more measures. In other words, little if any additional information was gleaned from the other measures and hence a simpler frontier could be formed without any loss of generality. The firm-year combinations represented the highest performance combinations over the full study period from the full list of all major oil companies — this accounts for the fact that three of these four companies do not appear in Tables 1 and 2.
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28. Reckitt & Colman PLC and Benckiser NV were separate large companies that merged in 1999 to form Reckitt Benckiser.
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