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# BUILDING MINIMUM VARIANCE PORTFOLIOS WITH LOW RISK, LOW DRAWDOWNS AND STRONG RETURNS

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**STOXX**

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# STOXX MINIMUM VARIANCE INDICES

## Introduction

In the wake of the global financial crisis, minimum variance equity strategies quickly gained traction by capturing the attention of a risk-aware and risk-averse investment community. But minimum variance portfolios (MVPs), sometimes referred to as minimum volatility portfolios, offer much more than just an efficient way to lower portfolio volatility. For a growing number of investors, MVPs are now seen as delivering the “best of all worlds”: low risk, low drawdowns and strong returns.

While the popularity of these strategies has been markedly more pronounced in recent years, it should be recognized that minimum variance has been in the market for decades. The theory from which the strategy derives its legitimacy is Harry Markowitz's seminal work published in 1952, which was recognized by the Nobel Prize committee in 1990.<sup>1</sup> The practical importance of low volatility has been championed by R. Haugen and A. J. Heins<sup>2</sup> since the mid-1970s, when it started to challenge the generally accepted paradigm of the Efficient Market Hypothesis of E. Fama.<sup>3</sup>

Despite extensive academic research supporting the use of minimum variance, adoption of this strategy is still in the beginning stages. Important practical questions must be answered to provide clarity in the industry. With the focus on reduction of risk, it is natural to assume that there is a return trade off; however there is much academic research and increasing empirical evidence that a minimum variance portfolio provides strong historical total returns and Sharpe ratios. This evidence has seen the MVP become much more commonplace across the marketplace, with momentum growing among institutional investors, mutual funds and ETF sponsors.

STOXX has partnered with Axioma to create innovative minimum variance indices that start with a representative STOXX equity index and use Axioma's multi-factor risk models to estimate a covariance matrix and the Axioma optimization tool to construct the optimal minimum variance index.

Since this paper provides an introduction to the STOXX Minimum Variance Indices, we aim to achieve three things:

- i) give an overview of minimum variance investing
- ii) explain the methodology for the construction and maintenance of the STOXX Minimum Variance Indices, highlighting the unique approach for the index series
- iii) discuss how investors can make use of the minimum variance concept

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<sup>1</sup> Markowitz, H. (1952), “Portfolio Selection”, *The Journal of Finance*, Vol. 7, No. 1 (Mar., 1952), pp. 77-91.

<sup>2</sup> Haugen, R. A.; Heins, A. J. (1972), “On the Evidence Supporting the Existence of Risk Premiums in the Capital Market”, *University of Wisconsin-Madison*.

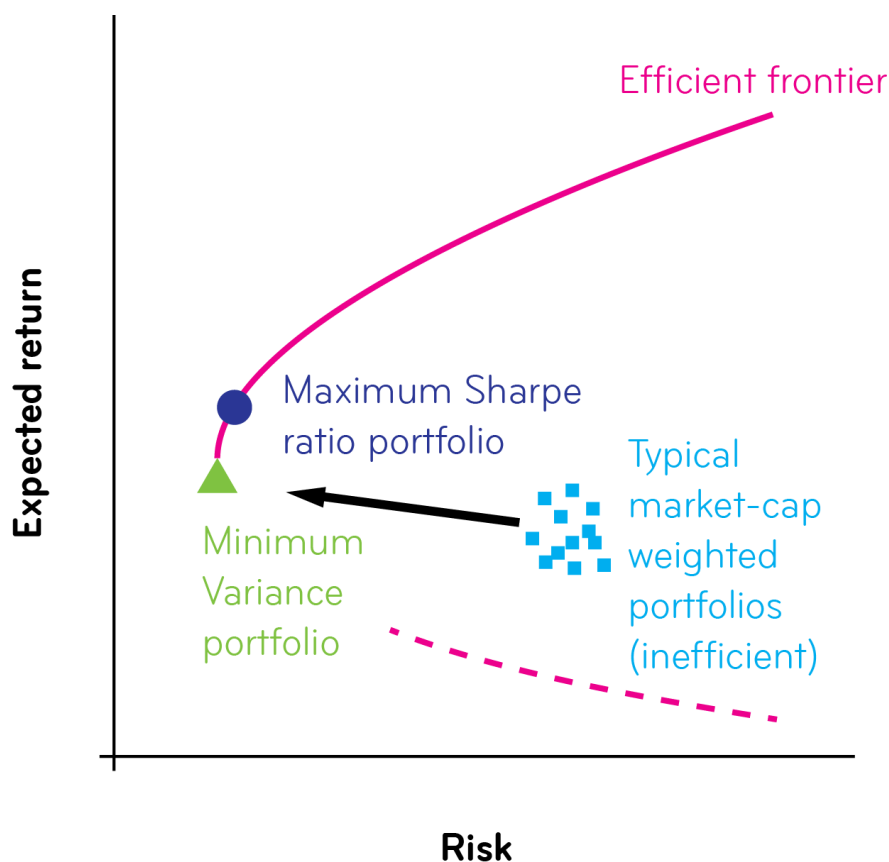
<sup>3</sup> E. F. Fama, (1965) “The Behavior of Stock-Market Prices” *Journal of Business* (January, 1965).

# STOXX MINIMUM VARIANCE INDICES

## 1 Overview of minimum variance investing

As mentioned above, the theoretical MVP has been widely known since the seminal paper by Harry Markowitz was published in 1952. In diagrammatic terms, the MVP is found at the very left tip of a mean-variance efficient frontier of feasible portfolios, as shown in Figure 1.

FIGURE 1: EFFICIENT FRONTIER OF FEASIBLE PORTFOLIOS.



No expected returns are used in the construction of MVPs; the portfolio relies on the covariance matrix to construct an optimal portfolio by minimizing portfolio variance. Using individual asset volatilities and multi-asset correlations, the MVP identifies a composition with the lowest possible variance (or equivalently volatility). At that point, all assets in the optimal portfolio have the same marginal contribution to the total predicted risk of the portfolio and their returns are irrelevant for the estimation.

Any portfolio on the efficient frontier has an optimal risk-return ratio. No other portfolio can have a higher return for the same level of risk, or a lower risk for the same return. Therefore, any portfolio that is not on the efficient frontier is dominated by a superior portfolio on the frontier. Of all portfolios, the MVP is the only one on the efficient frontier that does not rely on the estimation of asset returns, which is difficult to do with any reliability.

# STOXX MINIMUM VARIANCE INDICES

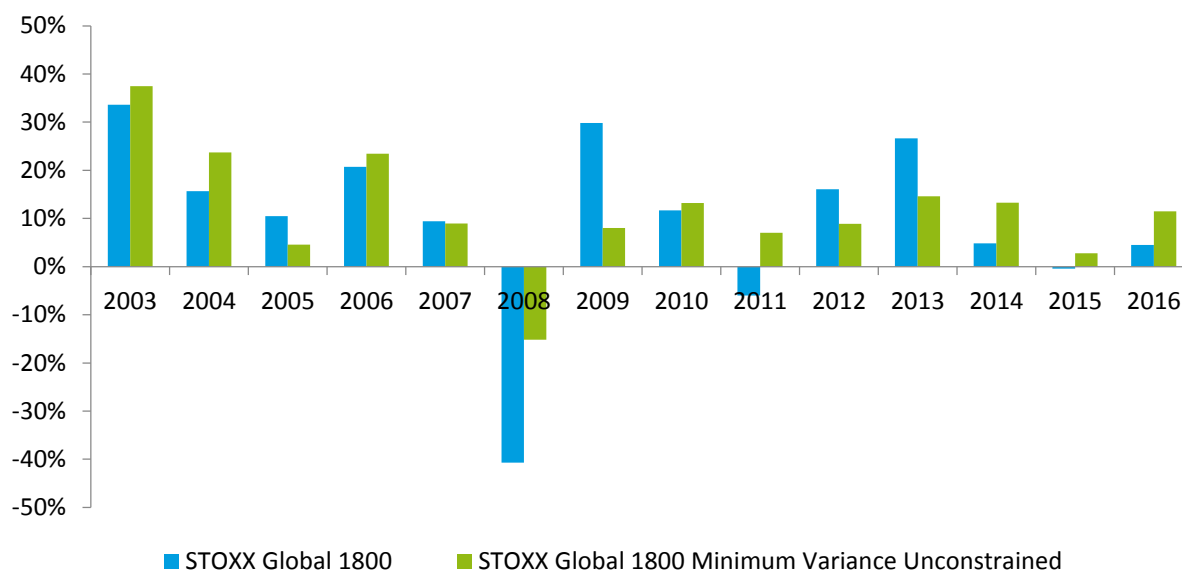
Although no expected returns are needed to create MVPs, there are three important inputs that are needed:

- i) a forecast of variances and covariances
- ii) an optimization engine
- iii) a set of constraints that ensures the portfolio is reasonably investable

More details of the approach taken can be found in the next section.

The performance characteristics of the MVP can be seen in the chart below:

FIGURE 2: ANNUAL RETURNS OF THE STOXX GLOBAL MINIMUM VARIANCE INDICES.



Source: STOXX data from Jan. 2, 2003 to Jul. 29, 2016 for USD Net Return versions

Although MVPs generally outperform market portfolios with lower risk in the long run, over the short term, relative performance is somewhat dependent on market conditions. The asymmetric response of the MVPs to market movements point to their ability to provide a level of downside protection.

It is commonly thought that MVPs outperform in bear markets and underperform in bull markets. As can be seen from Figure 2, this need not be the case. Over the last 14 years, the STOXX Global 1800 Minimum Variance Unconstrained Index has outperformed the benchmark during the three negative years (by an annual average of 14%) and six out of the eleven positive years, while having about the same average annual return of 16% over these eleven positive years.

# STOXX MINIMUM VARIANCE INDICES

## 2 Characteristics of a minimum variance portfolio (MVP)

There is a common misconception that minimum variance indices are just another “smart beta” product, but we would argue differently. Most indices can be used as building blocks as part of a greater portfolio and need to be used as such, being unsuitable for standalone allocations. MVPs, on the other hand provide investors with a fully-fledged portfolio management strategy that consistently gives the optimal allocation in order to reduce risk. This involves dynamically rotating around stock, industry, geographical and factor allocations, taking into account current market information in order to always hold the portfolio with minimum risk.

Importantly, minimum variance does not equate to a simple allocation to the low volatility factor, which would be represented by a portfolio with long low volatility stocks and short high volatility stocks. The dynamic allocation and the incorporation of correlation risk makes minimum variance a much more reliable portfolio management strategy.

MVPs take on certain biases when compared with the market capitalization weighted portfolio. The latter can be considered to be a large-cap biased strategy, which also leads to its own bias toward factors related to large size, such as high liquidity and low leverage and of course large size. Looking at active exposure of the MVP (exposure of MVP minus exposure of the benchmark), we logically find inverse allocation to size, liquidity and leverage, as seen in Figure 3. It is debatable whether MVPs under-allocate to size and liquidity and over-allocate to leverage, or whether they simply reduce the built-in biases of the benchmark with respect to these factors. There is also extensive research showing that liquidity tends to be a premium that investors pay<sup>4</sup> for and causes portfolios to underperform in the long run.

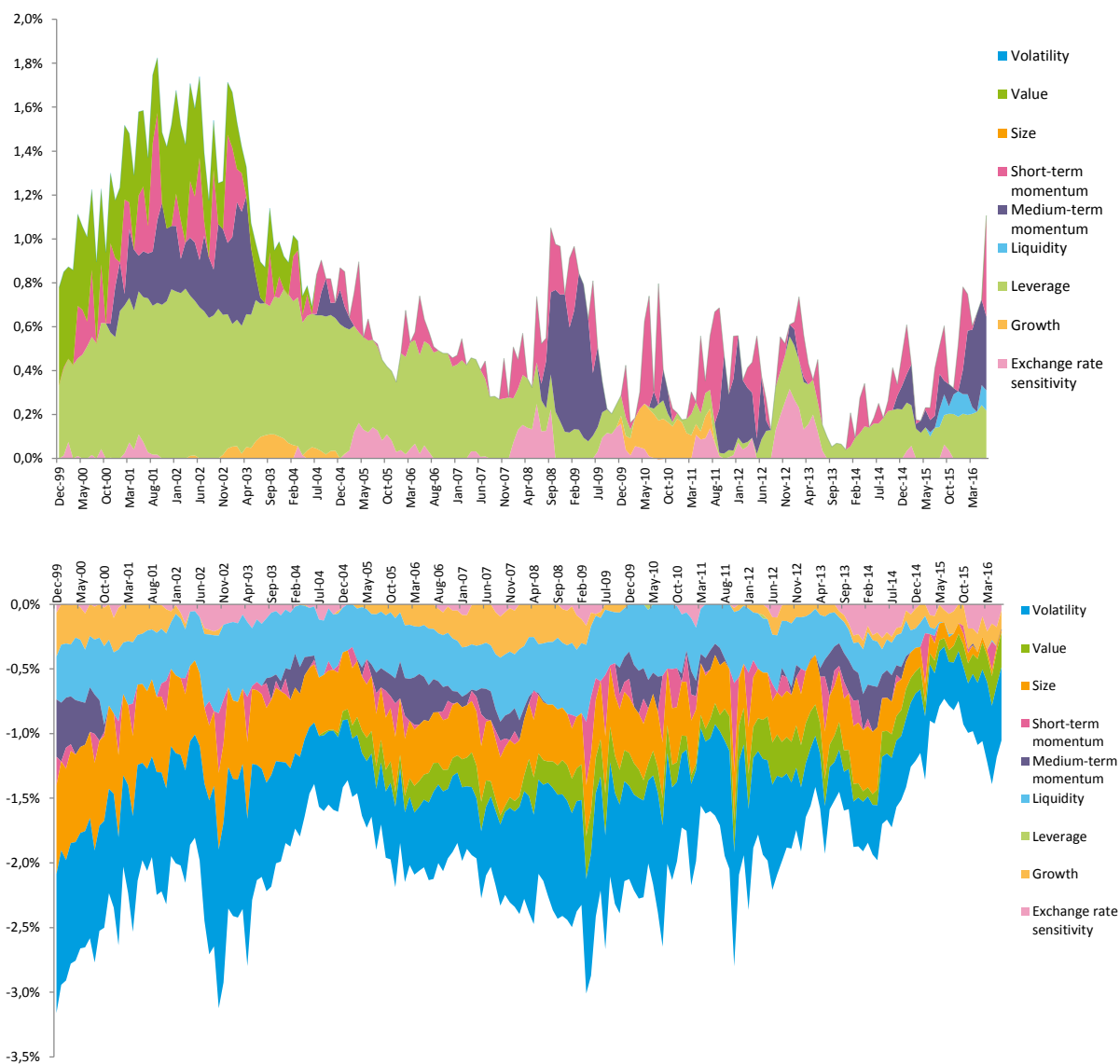
Reassuringly, there is a consistent large negative allocation to volatility, which is targeted by the concept.

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<sup>4</sup> Bekaert G., Harvey C. R., Lundblad C. (2003): “Liquidity and Expected Returns: Lessons from Emerging Markets”, Duke University.

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FIGURE 3: ACTIVE EXPOSURES TO STYLE FACTORS OF THE STOXX GLOBAL 1800 MINIMUM VARIANCE UNCONSTRAINED RELATIVE TO THE STOXX GLOBAL 1800.



Source: STOXX monthly data from Dec. 1999 to Jul. 2016. Factors shown are the standard Axioma style factors.

Note: cumulative factor exposures of a strategy relative to a benchmark do not generally add to zero as it is measured in terms of risk allocation..

# STOXX MINIMUM VARIANCE INDICES

## 3 Why minimum variance portfolios provide better risk-adjusted returns

MVPs tend to strongly outperform market capitalization weighted portfolios while reducing risk in the long term. In order to trust that this trend will continue and is not just a stroke of luck, it is important to understand the fundamental reasons for this behavior, especially as it contradicts the popular belief that more risk will lead to more returns, as per the CAPM.<sup>5</sup>

First and foremost, we clarify that this behavior is not completely contradictory to the CAPM, as the market capitalization weighted index is not necessarily the "market portfolio". More work would be needed to show this in detail but that is not the focus here. Therefore market capitalization weighted portfolios take on some diversifiable risk which is not remunerated by any risk premium. MVPs, in theory, do not take on these risks and so benefit from lower risk while not reducing returns. However, this alone does not explain outperformance.

The low volatility anomaly has been defined as "among the many candidates for the greatest anomaly in finance"<sup>6</sup>, and many papers have been written attempting to explain the phenomenon. While it is unclear if a 'smoking gun' has been discovered to explain the anomaly, there are many potential reasons that have been extensively discussed:

- i) **Delegated portfolio management (agency pricing)**  
Because of the way the asset management industry is laid out, portfolio managers often have a greater utility from profit than from loss, for example, through the application of performance fees. Therefore volatile stocks are often sought out in pursuit of greater profits while somewhat neglecting the downside risk. This can lead to an overpricing of volatile assets, which causes underperformance and hence outperformance of less volatile assets.
- ii) **Leverage aversion**  
Many investors are not able to employ leverage. This can lead them to take on higher risk securities in order to achieve target returns. This effect also leads to overpricing of volatile stocks.
- iii) **Tracking error focus**  
As managers continue to focus on tracking error as a key measurement of success, any asset that takes them away from the benchmark becomes high risk. Therefore, low risk becomes high risk and managers avoid low risk assets, leading to their underpricing as well as crowding in specific assets. This crowding effect not only increases the pricing risk of these assets but also increases their correlation.
- iv) **Get rich quick**  
Investors looking for quick returns flock to buy the most volatile assets, leading to overpricing – otherwise known as the 'lottery ticket effect'.

<sup>5</sup> Sharpe, William F. (1964). "Capital Asset Prices: A Theory of Market Equilibrium under Conditions of Risk". *Journal of Finance*. 19:3, pp. 425-442.

<sup>6</sup> Baker M., Bradley B., Wurgler J. (2011). "Benchmarks as Limits to Arbitrage: Understanding the Low-Volatility Anomaly". *Financial Analyst Journal*.

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**v) The winner's curse/jumping on the bandwagon**

As certain assets achieve exceptional returns, they often get more attention, especially when these returns are quick and thus volatile. This gain in attention often increases these assets' volatility even further as more investors trade them. Investors, seeing a good performance, sometimes jump on the bandwagon to benefit from a potential upside, often neglecting intrinsic values. This leads to the overpricing of increased volatility stocks.

**vi) Neglect**

Many high profile stocks garner media attention, while some of the more 'boring' assets are overlooked. These higher profile stocks tend to be more volatile as many investors trade them more often than necessary. This is another link between high volatility and overpricing.

**vii) Expectations and its risk implications**

Companies with higher expectations will most likely have higher volatility as investor response to results will be more severe. The higher the expectations, the higher the chance of investor disappointment.

These behaviours describe how there tends to be a strong relationship between volatility and overpricing, and furthermore explain some of the reasons for risky assets to be more highly correlated with each other.

MVPs seek to minimize risk. Therefore they will tend to go for lower volatility assets, while reducing allocation to those assets that are highly correlated. In doing this, MVPs select assets that may be underpriced. As this underpricing is reduced and the components become more volatile and correlated to other assets, their weight is reduced in the MVP and may even be phased out. In this process, the MVP can achieve and historically has achieved outperformance.

When looking at some of the proposed reasons why the MVP outperforms, one observes that the current structure of the market and some fairly fundamental human instincts are behind the success of this strategy. Delegated mandates, tracking error and leverage aversion are unlikely to disappear from the market any time soon. Investor behaviours such as neglect, 'get rich quick' and 'jumping on the bandwagon' are equally unlikely to vanish. Consequently, it is unlikely that the market will arbitrage away the strategy of the MVP any time soon.

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# STOXX MINIMUM VARIANCE INDICES

## 4 Methodology of STOXX Minimum Variance Indices, highlighting the unique approach for the index series

As the minimum variance concept has grown in importance, indices have been created to reflect the concept and to allow benchmarking, as well as to provide cost-effective access to this strategy for market participants. There are two types of indices on the market:

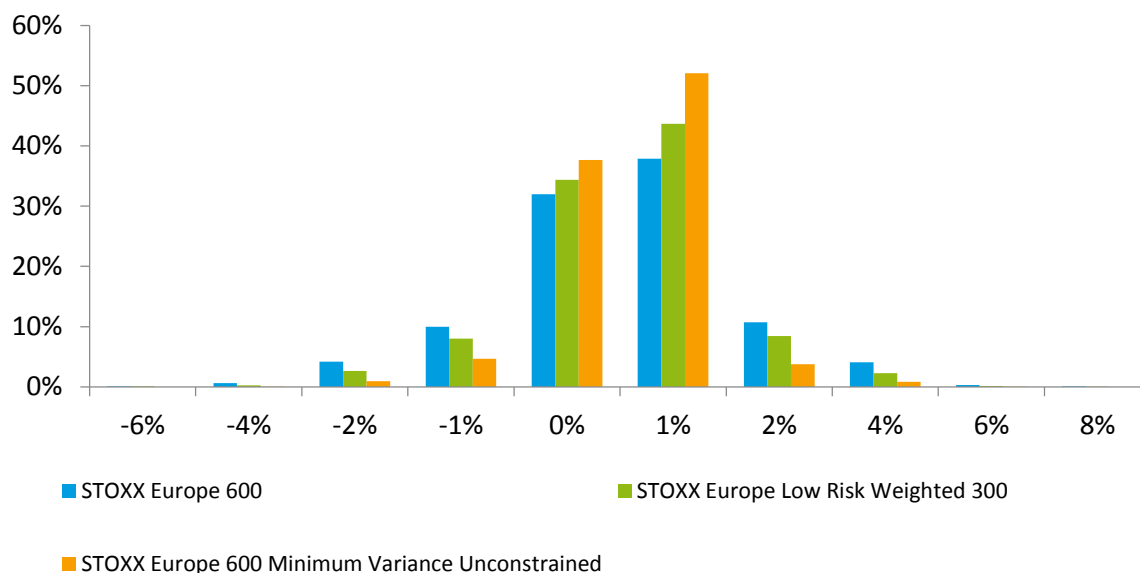
- i) Simple volatility measures
- ii) Optimized portfolios

### Simple volatility measures

A simple way to get low risk portfolios is to rank the stocks in any particular benchmark by their volatility and then to use a portion of the least volatile stocks to create a low volatility portfolio. The constituents of a low volatility portfolio can be weighted relative to the inverse of their corresponding volatility, with the least volatile assets receiving the highest weights.

This approach has the advantage of a simple and transparent methodology with similar risk and return characteristics of the optimized MVP. It does relatively well at reducing risk, especially on the downside, and tends to create outperformance relative to the cap-weighted benchmark.

FIGURE 4: DISTRIBUTION OF RETURNS FOR A LOW RISK WEIGHTED INDEX AS WELL AS AN MVP COMPARED TO THE BENCHMARK.



Source: Bloomberg, STOXX daily data from Jan. 2, 2004 to Jul. 29, 2016 for AUD GR versions

Losses exceeding 1% happen on 9%, 7% and 3% of days for the benchmark, the low risk index and the MVP respectively. Positive gains occur on 52%, 53% and 53% for the benchmark, the low-risk index and the MVP respectively.

# STOXX MINIMUM VARIANCE INDICES

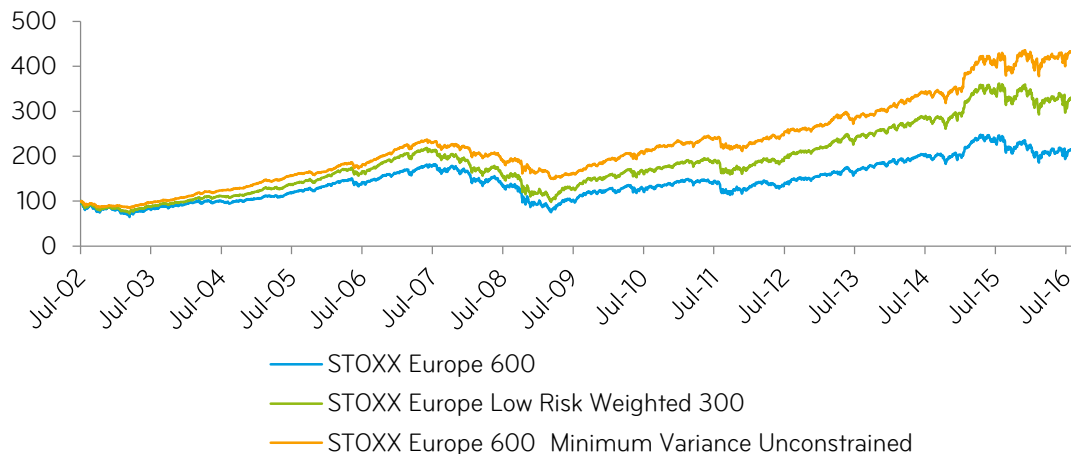
However, when one looks at the details of the portfolio created by this methodology, there is clear concentration risk. There is no correlation analysis and the final portfolio is at the mercy of the original benchmark composition. If a stock in the benchmark was to split into three separate but identical companies, each with the same risk, the low risk weighted portfolio would now assign a weight three times as important, without legitimate justification. Furthermore, simple low volatility selection concentrates a portfolio in assets that share similar attributes, which accentuates systemic risks.

In an analysis of the PowerShares S&P 500® Low Volatility ETF that tracks the S&P 500® Low Volatility Index many of these concentrations come to light:

- close to 60% of the portfolio was found to be invested in utilities and consumer staples sectors
- a strong small-cap bias was observed
- a low liquidity bias was observed

Any market movement that adversely impacted, say, utilities would have a major impact on this portfolio. Minimum variance, on the other hand, does not necessarily stock up on low volatility stocks only, but also seeks to diversify the risk. Therefore these concentration risks are avoided. As Figure 5 illustrates, there is very little downside protection stemming from the risk reduction of the low risk methodology.

FIGURE 5: PERFORMANCE OF MINIMUM VARIANCE AND RISK WEIGHTING.



Key figures	STOXX Europe 600	STOXX Europe Low Risk Weighted 300	STOXX Europe 600 Minimum Variance Unconstrained
Return (annualized)	5.5%	8.7%	10.8%
Volatility (annualized)	20.2%	16.0%	10.8%
Maximum drawdown	58.4%	55.0%	37.1%
Return/volatility	0.27	0.54	1.00

Source: STOXX daily data from Jan. 2, 2004 to Jul. 29, 2016 for EUR Gross Return versions.

## STOXX MINIMUM VARIANCE INDICES

Although the low risk weighting approach does quite well at reducing risk and improving returns, it is not a genuine risk-reduction methodology, as it is subject to the composition of the benchmark. By this we mean that it may have unexpected behavior in certain markets or certain times and that it cannot be counted upon to consistently reduce risk.

As the results in Figures 4 and 5 suggest, minimum variance does a more consistent job at reducing risk. We see that the distribution of returns is more desirable using a minimum variance index than a simple risk-reduction strategy. Drawdowns are smaller and occur less often for the MVP and it has a higher average return. Further, the market capitalization weighted benchmark has fatter tails. In other words, a low risk weighted portfolio is an impure attempt at achieving a Low Risk factor allocation. This does not adequately compare with MVP which gives the optimal factor allocation in order to reduce portfolio risk, albeit with a significant Low Risk factor bias.

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# STOXX MINIMUM VARIANCE INDICES

## 5 A tale of two minimum variance indices

The STOXX Minimum Variance Indices provide market participants with an easy way to track MVPs in specific markets. For each market – global, regional and country-specific – two versions are made available: Constrained and Unconstrained.

The Unconstrained version is optimized with minimal constraints, which pertain to tradability and investability, and aims to be on the efficient frontier. The Constrained version seeks to also reduce different risks, such as peer and benchmark risks. By making this second version more constrained to match the market index in terms of risk exposures, it reduces peer and benchmark risks while providing a much improved risk profile (and also returns, for reasons explained previously).

### The optimization

For any minimum variance index, we start with a market capitalization weighted broad index, which seeks to cover about 90% of the market cap of the investment universe. Using this index as a starting selection universe, we apply a constrained optimization to obtain the set of weights which minimize predicted portfolio variance, while satisfying all constraints.

In order to minimize risk, we must estimate it. There are generally two ways of estimating the covariance of a portfolio: simple historical covariance or using a factor model. Using the historical covariance approach, if we take the STOXX Global 1800 portfolio as an example, we need to create a matrix,  $C$ , of size 1,800 by 1,800, which shows the 1,618,200 different pairwise covariances:

$$\text{Portfolio Variance} = w' C w$$

Where  $w$  is the vector of weights. This is a huge number of parameters to estimate and thus will require us to go very far back in time to obtain sufficient observations to estimate all the parameters (more than 1,800 days or seven years). Furthermore, each day only provides 1,800 observations as only the concerned stocks' time series are considered. We are therefore doing a lot with little information, yielding poor predictive power.

STOXX has teamed up with Axioma to implement a superior methodology. We use Axioma's fundamental factor model to estimate risk effectively. In this framework, the exposure of each stock to each factor is estimated by the model, and so the covariance of two stocks is determined indirectly through their individual exposures to the factors:

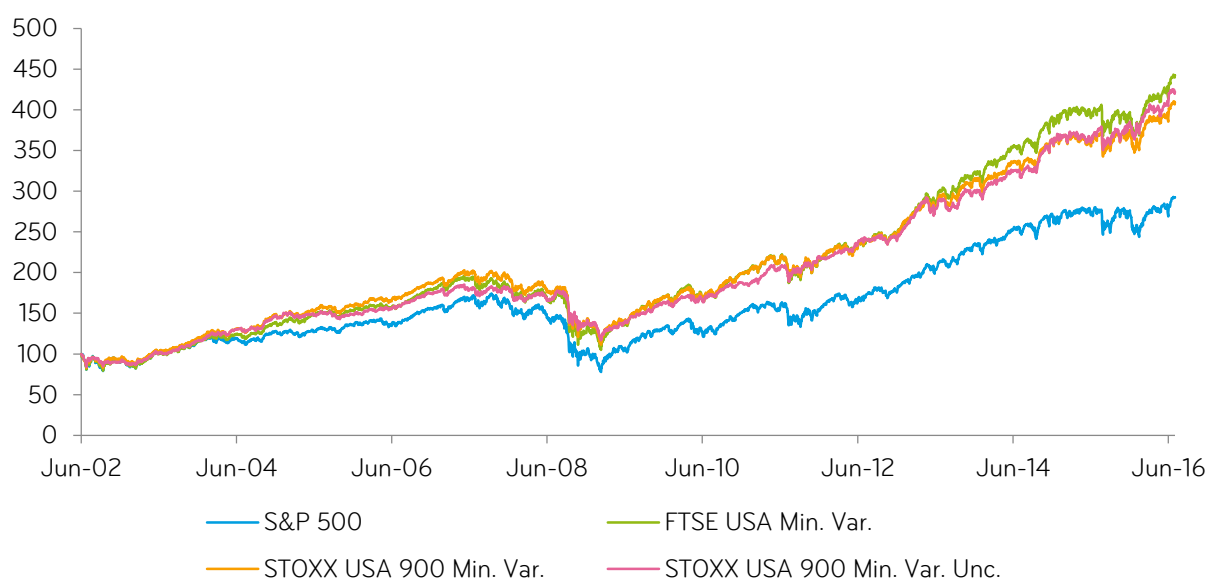
$$\text{Portfolio Variance} = w' (E' F E) w + S$$

Where  $E$  is the matrix of exposures of the stocks to the factors, and  $F$  is the covariance matrix of the factors and  $S$  represents the residual specific variances. Note that if there are 50 relevant factors, this yields a problem of size 1,800 by 50 and not 1,800 squared as per the historical covariance approach. Thus the problem does not scale exponentially and dealing with a decent universe size is possible. Many implementations of the historical covariance approach slice the starting universe to obtain a more manageable portfolio size. However an optimal solution on a reduced universe will always yield a result that is the same or inferior.

# STOXX MINIMUM VARIANCE INDICES

Furthermore, a factor model is updated using information from the entire market and not only the stocks in the portfolio of interest. Therefore this approach estimates far fewer parameters and uses more information, yielding a stronger predictive power. This theoretical reasoning is proven in practice as exemplified in Figure 6. The FTSE index, which does not use a factor model for optimization has no constraint relative to tracking risk and still achieves a risk higher than both STOXX index versions. This example on the US market is representative of all regions where both types of indices exist: the STOXX Minimum Variance Unconstrained always has lower realized risk when compared to other index methodologies.

FIGURE 6: FTSE USA MINIMUM VARIANCE IS OPTIMIZED USING A HISTORICAL COVARIANCE APPROACH. THE STOXX INDICES USE A FACTOR MODEL APPROACH.



Key figures	S&P 500	FTSE USA Minimum Variance	STOXX USA 900 Minimum Variance	STOXX USA 900 Minimum Variance Unconstrained
Return (annualized)	.7.8%	10.9%	10.3%	10.6%
Volatility (annualized)	19.9%	15.5%	15.1%	12.4%
Maximum drawdown	55.3%	46.4%	45.2%	36.9%
Return/volatility	0.40	0.71	0.68	0.85

Source: STOXX, Bloomberg, daily data from Jun. 28, 2002 to Jul. 29, 2016 for USD Gross Return versions.

## The Constraints<sup>7</sup>

An optimization will often result in a narrow portfolio. This can lead to certain concentration risks and lead to over exposure to risks that the model will have difficulty estimating, such as fraud (i.e. in the case of Enron), natural disaster (catastrophe hitting a firm's headquarters or place of business) and so on. To

<sup>7</sup> See Appendix for a summary table

## STOXX MINIMUM VARIANCE INDICES

protect the portfolio against these risks, some constraints will be applied in order to force a certain level of diversification. In this framework, we apply the following two constraints:

All indices comply with UCITS regulation at rebalancing; in fact the component capping applied is even stricter than UCITS requirements. Every component in the index is capped to have a maximum weight of 8%. All components with weight of at least 4.5% will not exceed 35% of the weight of the portfolio when combined. This 4.5/8/35 capping is a tougher application of the 5/10/40 standard so that compliance is very rarely breached and if there is ever a breach, it would take little trading to bring it back to compliance.

We then enforce that the minimum variance index has an effective number of assets of at least 30% of that of the base index. This is a relevant way of enforcing diversification without stating a specific number of assets (which an optimizer would just circumvent by applying insignificant weights to additional components). This constraint is based on Hirsch-Herfindahl<sup>8</sup> diversification, which is a well-accepted measure.

The Unconstrained index is rebalanced monthly and is allowed to have a turnover of 5% one-way (or 60% annual). The Constrained version rebalances quarterly with a 7.5% turnover (or 30% annual), in sync with the base index.

These are the only constraints applied on the Unconstrained version. In addition to these, we apply on the Constrained version relative exposure limits to countries, industries and risk factors. The Constrained minimum variance indices can only have the benchmark's country and industry allocation +/- 5% and the style factors (all Axioma style factors except Size and Volatility) exposures have to be the same within a quarter standard deviation. Therefore, the Constrained minimum variance index takes on very similar risks as the benchmark, but to a lesser extent, and so the resulting portfolio is similar but reduced for risk (and increased for returns).

Every day that the portfolio is not rebalanced, it will evolve in a non-optimal way as the weights change with market-price changes. In theory, any strategy should rebalance continuously, which is not feasible. Therefore there is a trade-off between transaction costs on one side and optimality on the other. To analyze the impact of the rebalancing frequency, we conducted a test to see the average daily predicted risk for a Minimum Variance portfolio with the same criteria but decreasing frequency, as shown in Figure 7. We see that, with the same turnover, changing the frequency to semi-annual has a significant impact on risk.

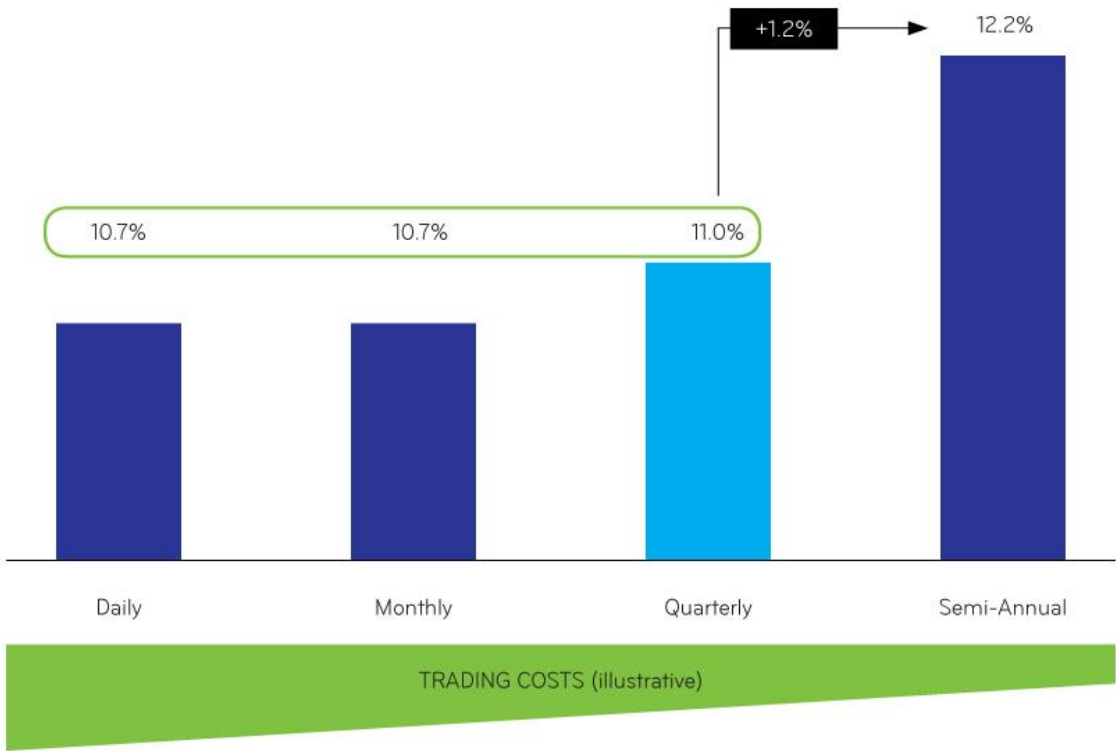
Although semi-annual rebalancing is practical, the risk consequences of the choices have made STOXX choose smaller rebalancing frequencies. Furthermore, one must bear in mind that it is necessary to allow a certain amount of trading and turnover in order to allow optimality and gain benefits from the optimization.. On a long enough time scale without rebalancing, any portfolio becomes market capitalization weighted with its inherent flaws.

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<sup>8</sup> "Herfindahl-Hirschman Index". USDOJ. Retrieved Dec. 31, 2013.

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FIGURE 7: THE DAILY AVERAGE OF PREDICTED RISK FOR THE SAME PORTFOLIO, BUT WITH VARYING FREQUENCIES FOR THE STOXX EUROPE 600 MINIMUM VARIANCE.



Source: STOXX data from Aug. 2003 to Oct. 2011.

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## 6 Minimum variance performance

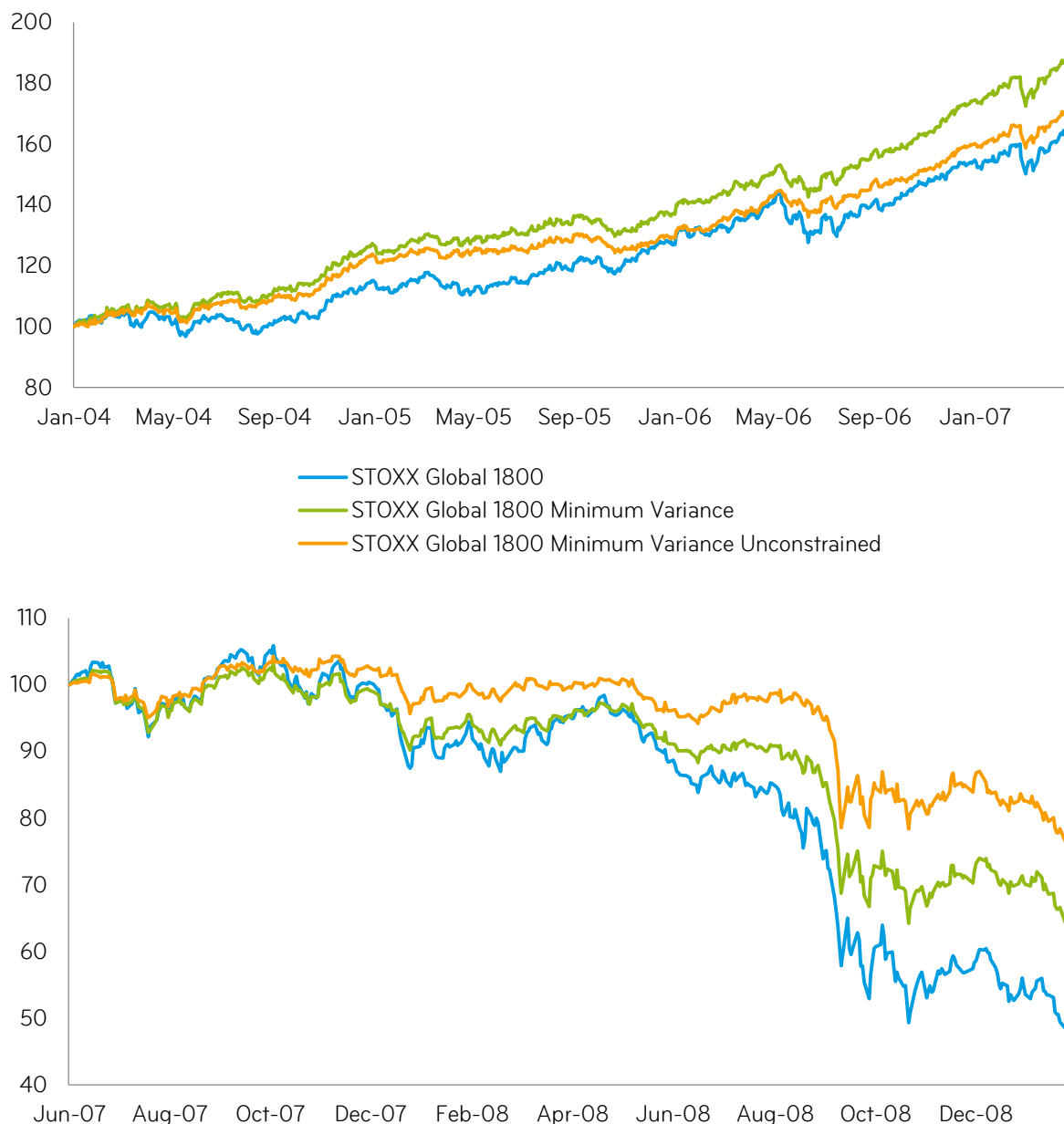
All STOXX Minimum Variance Indices have showed consistent outperformance and strong risk reduction across all regions and countries in both backtests and live periods. Even in emerging markets, we have seen that there would be tremendous value in investing in minimum variance.

We see a consistent picture across all markets, where the STOXX Minimum Variance Unconstrained index has the lowest risk of all, followed by the STOXX Minimum Variance index, which also significantly reduces risk. Performance-wise, the Unconstrained version is often the best performer, while both versions outperform the market systematically.

An important point to note is that the performance of minimum variance is not fully defensive. In every market, minimum variance has outperformed every year the market has been down, but it has also outperformed on most positive years. As can be seen from Figure 8, minimum variance can outperform in bear and bull markets.

# STOXX MINIMUM VARIANCE INDICES

FIGURE 8: PERFORMANCE OF MINIMUM VARIANCE IN BULL (ABOVE) AND BEAR (BELOW) MARKETS.



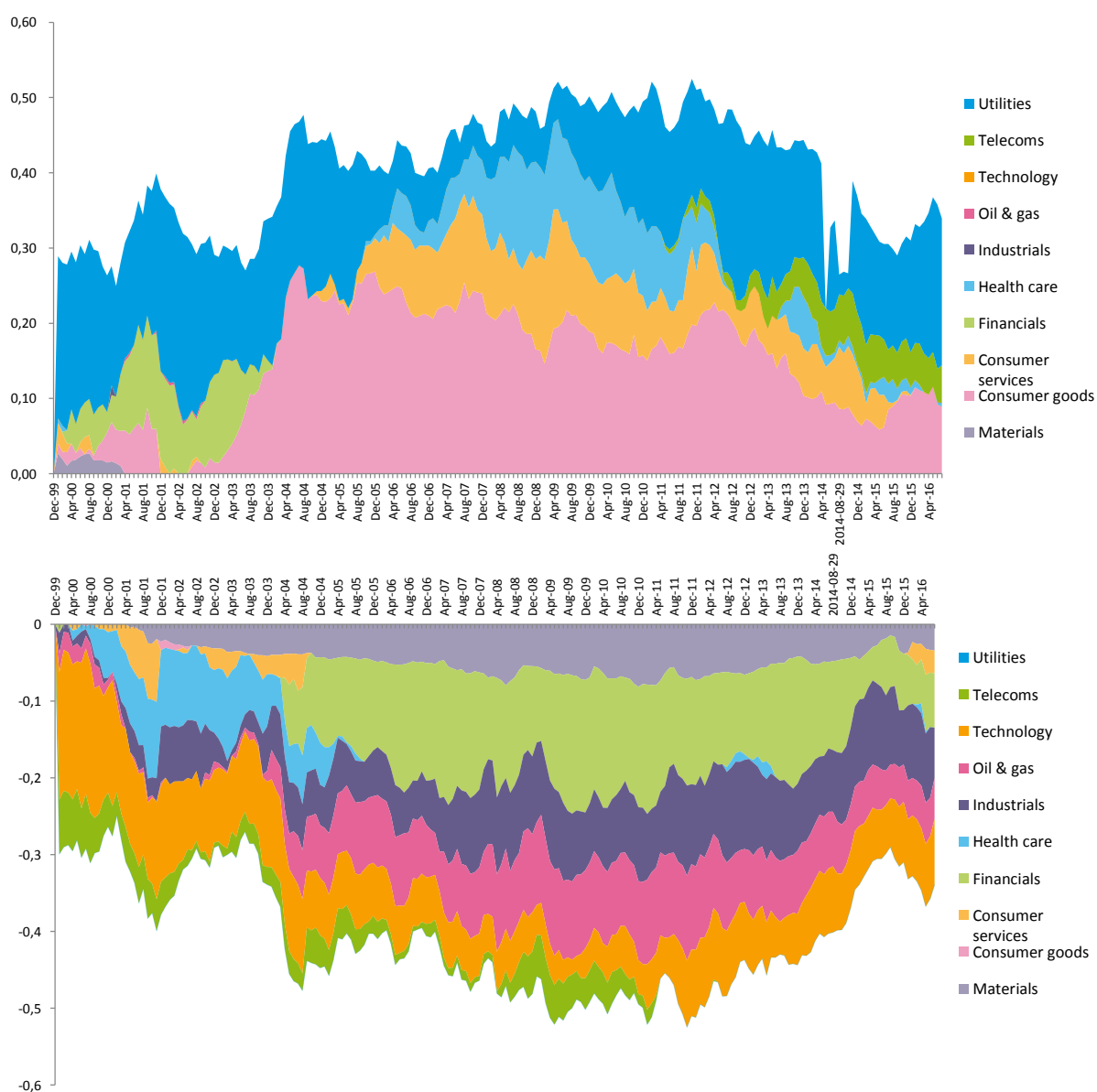
Source: STOXX daily data from Jan. 2, 2004 to Apr. 30, 2007 and Jun. 29, 2007 to Feb. 27, 2009 for EUR Net Return versions.

Minimum variance, seeking to minimize risk, has done very well in light of the global financial crisis. Looking at the allocation to financials before and during the crisis, we can understand the source of the outperformance. Indeed, minimum variance did not necessarily perceive individual financial stocks to become more risky, but the industry to become more correlated. Therefore the allocation to financial companies was minimized and the active allocation was negative years before the crash, as can be seen from Figures 9 and 10. In fact, looking at Figure 10, we see that the allocation to financials was at its absolute minimum when the financial index was at its peak (at the exact time of the downfall). This means that minimum variance was positioned protectively against the global financial crisis and could have served to point out that financial stocks were getting risky.

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This under-allocation to financials, as these stocks were rallying, might have caused temporary underperformance relative to the market. However, the crash of financials could have happened long before it actually did and so the MVP was being punished for making the right choice: reduced allocation to financials. As long as the investor understands the reasons for temporary underperformance, he will be more comfortable holding this portfolio until the expected outperformance is realized.

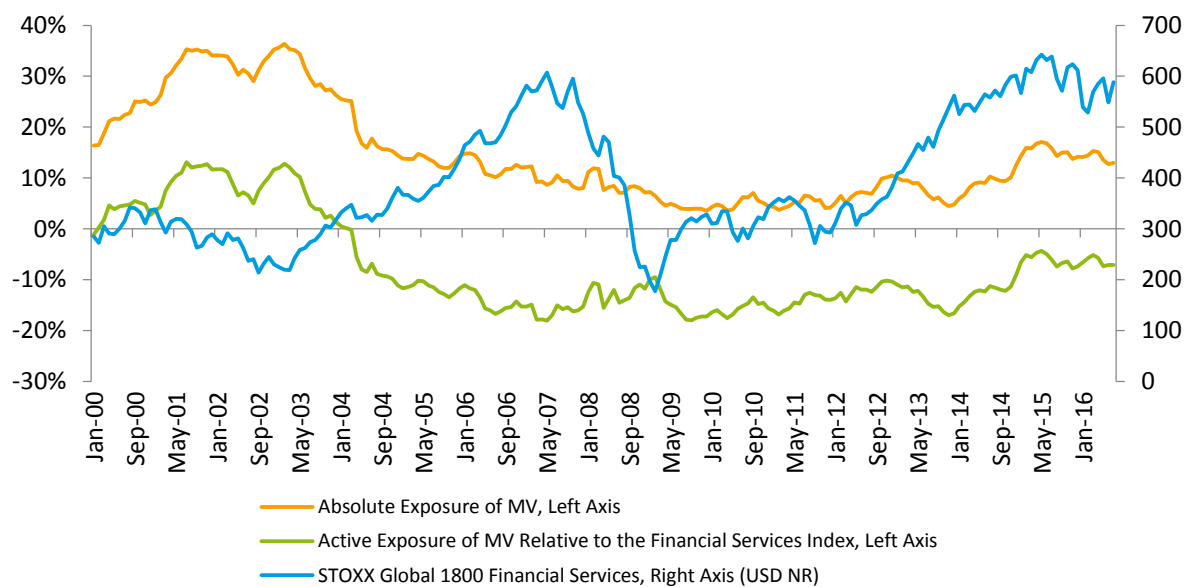
FIGURE 9: ACTIVE INDUSTRY EXPOSURE OF THE GLOBAL 1800 MINIMUM VARIANCE UNCONSTRAINED RELATIVE TO THE STOXX GLOBAL 1800.



Source: STOXX monthly data from Jan. 2000 to Jul. 2016. Industry classification according to DJ rules until Aug. 2004, and according to ICB rules afterwards.

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FIGURE 10: MINIMUM VARIANCE'S EXPOSURE TO FINANCIAL SERVICES THROUGH TIME.



Source: STOXX monthly data from Dec. 1999 to Jul. 2016. Industry classification according to DJ rules until mid 2004, and according to ICB rules afterwards.

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## 7 Putting the STOXX Minimum Variance Indices to use

As we have observed, the MVP has become widely popular over the past few years, and it is not unreasonable to believe that risk awareness and aversion following the financial crisis have driven investors toward less risky investments. In the MVP, investors have found a product that not only lowers risk but also maintains and enhances returns over the long term, and crucially appears to be a strategy that is not easily arbitrated away.

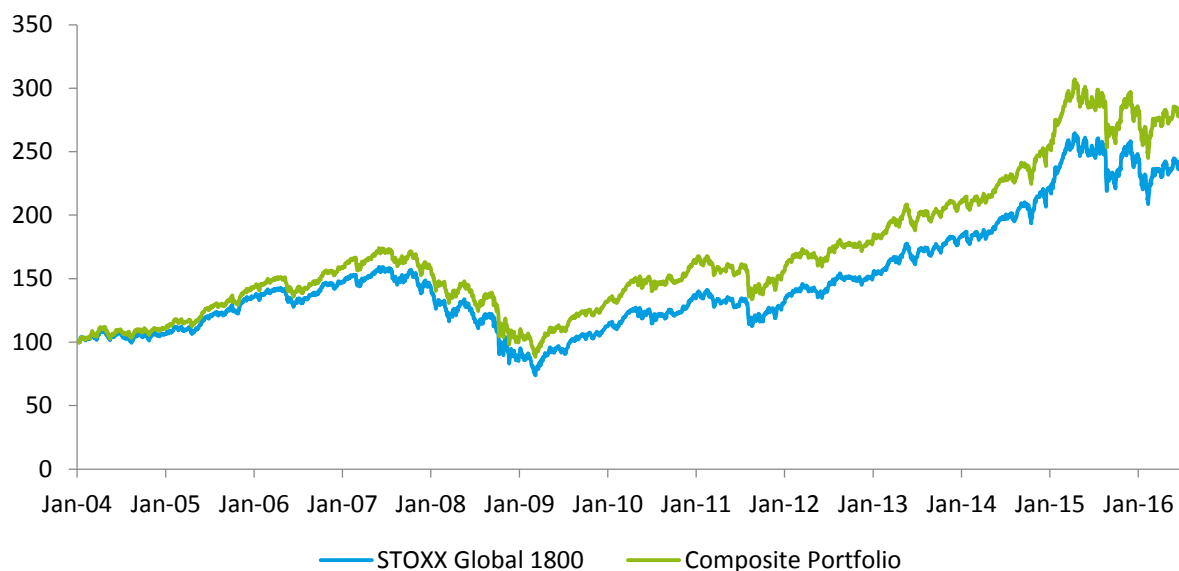
The analysis would suggest that the MVP is not just an investment to cover downside risk or to take an active 'bet' on the volatility of a region. But an MVP should be considered as part of an overall asset allocation for investors seeking to outperform the market or enter into better risk management.

Many investors adopt a core-satellite approach to portfolio management whereby the core portfolio needs to have huge liquidity due to large amounts being managed, and satellites can have lower liquidity. In this framework, minimum variance provides an ideal investment strategy as a satellite. It benefits from a very low beta, low risk and high performance. This also means that it can be combined with a higher beta portfolio (e.g. small caps) to give an average beta in line with targets, while providing outperformance on each satellite. Furthermore, an increasing amount of investors are tilting their core portfolio to include minimum variance allocation, which is warranted as it provides optimal portfolio management in a systematic way.

Looking at a practical example of this implementation, we can construct a portfolio with a beta of 1 using 60% core allocation to the market index (STOXX Global 1800) and 40% to two satellites (STOXX Global 1800 Minimum Variance Unconstrained and STOXX Global 3000 Small) as shown in Figure 11.

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FIGURE 11: THE EFFECT OF ADDING SATELLITE INVESTMENTS WHILE KEEPING A BETA OF 1.



Key figures	STOXX Global 1800	Composite portfolio
Return (annualized)	7.4%	8.8%
Volatility (annualized)	15.4%	12.4%
Maximum drawdown	53.7%	49.2%
Return/volatility	0.48	0.71

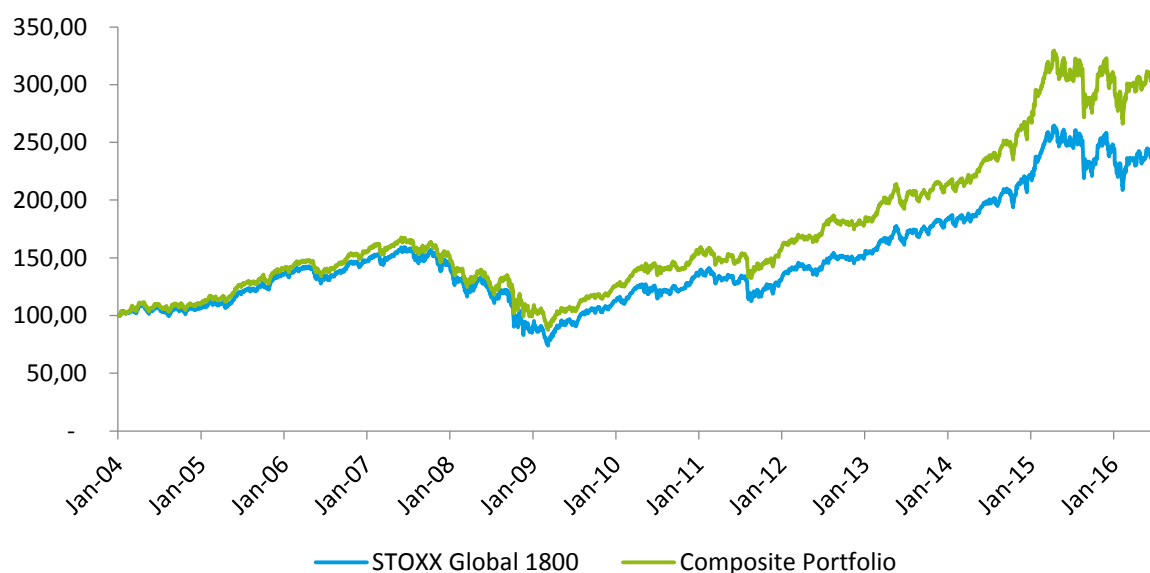
Source: STOXX daily data from Jan. 2, 2004 to Jul. 29, 2016 for USD Gross Return versions. Beta was calculated as the maximum of the 6 month and 1 year beta. When no satellite beta is greater than 1, weights were set to 20% for each satellite.

Clearly, we can observe many benefits of using these satellites as opposed to having a full investment in the core market portfolio. These percentages can be modulated according to the assets under management of the investor, where smaller AUMs can yield further improvements by increased allocation to these satellites.

In a second example, if we are ready to reduce the portfolio's beta and benefit purely from the MVP's increased return and diversification, one can easily build a portfolio composed of the market core and minimum variance as a satellite portfolio. In Figure 12, we look at having a portfolio which is composed of 60% market (STOXX Global 1800) and 40% MVP (STOXX Global 1800 Minimum Variance Unconstrained).

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FIGURE 12: PORTFOLIO WHICH IS COMPOSED OF 60% MARKET (STOXX GLOBAL 1800) AND 40% MVP (STOXX GLOBAL 1800 MINIMUM VARIANCE UNCONSTRAINED).



Key figures	STOXX Global 1800	Composite portfolio
Return (annualized)	7.4%	9.6%
Volatility (annualized)	15.4%	14.1%
Maximum drawdown	53.7%	47.9%
Return/volatility	0.48	0.68

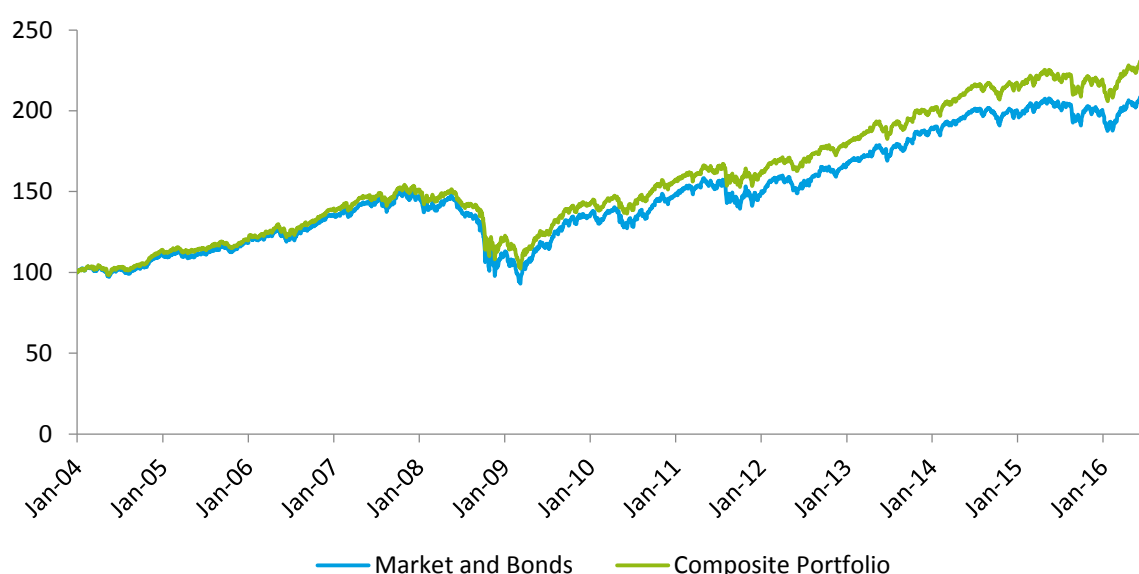
Source: STOXX daily data from Jan. 2, 2004 to Jul. 29, 2016 for USD Gross Return versions.

As seen in practice in some major pension fund portfolios around the world, the use of minimum variance enables a reduction in fixed income or other low risk, low return assets in order to increase equity allocation and improve return outlook. This is achieved through minimum variance's better use of risk budget, giving more expected return per unit of risk. Indeed, by replacing standard or risky equity investments with minimum variance, the investor reduces the risk of equity allocation, thereby allowing a higher equity proportion. In addition, minimum variance tends to outperform in the long run, so the investor not only increases allocation to equities but also improves it by making it more efficient.

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With this in mind, we show as a final example the benefit of adding minimum variance to a portfolio initially composed of 40% bonds (Barclays Capital Bond Composite) and of 60% equity market (STOXX Global 1800) by creating a composite portfolio of 35% bonds, 40% equity market and 25% minimum variance, as represented by STOXX Global 1800 Minimum Variance Unconstrained, shown in Figure 13.

FIGURE 13: THE EFFECT OF ADDING A MINIMUM VARIANCE SATELLITE TO AN ALREADY DIVERSIFIED PORTFOLIO.



Key figures	40% Bonds, 60% STOXX Global 1800	Composite portfolio
Return (annualized)	6.0%	6.9%
Volatility (annualized)	9.8%	8.4%
Maximum drawdown	38.4%	33.7%
Return/volatility	0.62	0.82

Source: STOXX, Bloomberg daily data from Jan. 2, 2004 to Jul. 29, 2016 for USD Gross Return versions.

Using the same data as in Figure 13, we can approximate an efficient frontier constructed from only these three assets: bonds, market and equity MVP as illustrated in Figure 14. It turns out that the maximum Sharpe ratio portfolio (assuming a risk free rate of 0%), has approximately 25% MVP, 75% bonds and no holding in the equity market. The multi-asset minimum variance portfolio including these three assets is composed approximately of 20% equity MVP and 80% bonds.

In the absence of the equity MVP, a two-asset maximum Sharpe ratio portfolio and minimum variance portfolios would have been identical and composed of approximately 10% market and 90% bonds. Risk and return characteristics are displayed in Figure 14.

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FIGURE 14: OPTMAL PORTFOLIO COMPOSITIONS WITH RESULTING CHARACTERISTICS

3 Asset Efficient Frontier	Market Weight	MVP weight	Bonds weight	Realized return	Realized risk	Sharpe
Maximum Sharpe Ratio Portfolio	0%	25%	75%	5.8%	4.0%	1.44
Minimum Variance Portfolio	0%	20%	80%	5.5%	3.9%	1.42
Max Sharpe/Min Var Portfolio without MVP	10%	-	90%	4.8%	3.9%	1.23

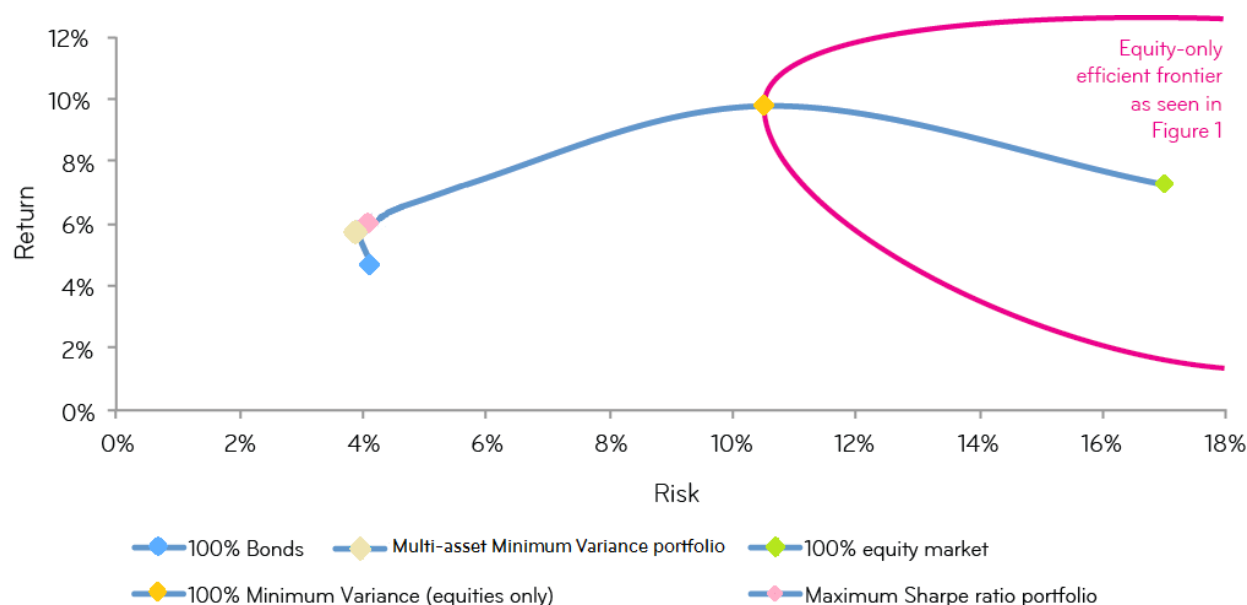
Source: STOXX, Bloomberg daily data from Jan. 2, 2004 to Feb. 27, 2015 for USD Gross Return versions. An interest rate of 0% is used to calculate the Sharpe ratios.

This exercise exemplifies that an equity MVP can be used to double equity allocation while keeping risk constant and significantly improving returns outlook.

In fact, all portfolios on the efficient frontier have 0% equity market holding! This is very telling and it suggests that any portfolio holding a market investment is sub-optimal, posing the question: why would an investor ever purchase the market when an MVP is available?

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FIGURE 15: "EFFICIENT FRONTIER" USING THREE ASSETS: BARCLAYS CAPITAL BOND COMPOSITE INDEX, STOXX GLOBAL 1800, STOXX GLOBAL 1800 MINIMUM VARIANCE UNCONSTRAINED.



Source: STOXX, Bloomberg daily data from Jan. 2, 2004 to Jul. 29, 2016 for USD Gross Return versions. An interest rate of 0% is used to calculate the Sharpe ratios.

As described previously, any allocation of the core portfolio to the market portfolio will pay for a premium for its liquidity and so it should only really be used if it is required. Arguably, depending on the portfolio size, a market capitalization weighted index does not need to represent the core of the portfolio and that many investors are over-paying for liquidity. These investors would benefit from the use of a "smart-beta" index, such as minimum variance, as a large satellite or even their core portfolio.

Other than for liquidity concerns, looking at the performance and risk figures make difficult to understand why an investor would choose a market capitalization weighted index as opposed to a minimum variance index, especially as the theoretical grounding arguably is more consistent for minimum variance weighting than for market cap-weighting.

A minimum variance index can be used directly as a benchmark for a passive or active mandate or as the basis for an exchange-traded product or custom notes. The index provides a way for passive investments to hold a portfolio on the efficient frontier. At the same time an active manager can use it as a benchmark to manage active positioning relative to an MVP.

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## 8 Conclusion

The MVP might be considered the “best of all worlds”: low risk, low drawdowns and long-term superior returns. As a strategy, minimum variance investing has clearly piqued the interest of a risk-aware, risk-averse investment community.

The creation of minimum variance indices makes these strategies widely available to sponsors of financial instruments and as benchmarks for minimum variance strategies. However, not all minimum variance indices are created equally.

To date, simple volatility weighting has proved more popular, but as we have seen such a strategy can lead to some significant issues, notably unintended concentration in sectors or risk factors and much higher realized risk.

The STOXX Minimum Variance Indices put the choice into the hands of the investor. The constrained STOXX Minimum Variance Index retains many of the characteristics of the underlying benchmark, whereas the STOXX Minimum Variance Unconstrained Index version aims to generate a portfolio that most accurately represents the theoretical MVP with constraints only being applied to ensure that the portfolio remains investable.

# STOXX MINIMUM VARIANCE INDICES

## 9 Appendix

	Unconstrained Version	Constrained Version
Component capping	» 4.5%/8%/35% to ensure UCITS compliance i.e. max. component capping of 8% and capping the sum of the weights of all components that have an individual weight above 4.5% to 35% of the index <sup>1</sup>	
Effective number of assets	» 30% of underlying broad index $H = \frac{1}{\sum w_i^2} \quad W = \text{component weight}$	» 30% of underlying broad index $H_{\text{Min Var}} \geq H_{\text{Base}} = 30\%$
Rebalancing and max. turnover	» Monthly rebalancing » 5% one-way turnover constraint » This means up to 5% of the portfolio is sold in order to purchase other components	» Quarterly rebalancing » 7.5% one-way turnover constraint » This means up to 7.5% of the portfolio is sold in order to purchase other components
Country/industry exposure	» Not all applied to unconstrained version	» Exposure to each country and industry is summed up for the underlying broad index, and the exposure of the Minimum Variance index has to be within 5% of those numbers
Factor exposure	» Not all applied to unconstrained version	» The Minimum Variance index is constrained to be within a 0.25 standard deviation of the base index exposure to each factor

1) Application of stricter rules than required UCITS constraints. The UCITS compliance states a 5/10/40 rule.

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