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# VIX: An Empirical Analysis of a New Futures Market

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# What is VIX?

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- The CBOE Volatility Index measures the implied volatility of S&P 500 index options at a 30 day time horizon
- VIX is negatively correlated to the returns on the S&P 500, as investors pay more for index options during a sharp market decline.

# Literature Review

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- Daigler and Rossi, *Journal of Investing*, 2006
  - A portfolio of VIX and SPX provides diversification benefits from 1992 to 2002.
  - Adding 10% to 20% VIX reduces portfolio volatility.
  - Risk falls faster than return
- Black, *Journal of Trading*, 2006
  - Hedge funds and SPX have negative skewness and excess kurtosis, 1994 to 2005.
  - 11.87% VIX and 88.13% SPX restores normal skewness to an equity portfolio, while reducing volatility.

# Literature Review

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- Dash and Moran, Journal of Alternative Investments, 2005
  - Adding 5-10% VIX to a hedge fund portfolio reduces downside risk.
- Brooks and Kat, Journal of Alternative Investments, 2002
  - Hedge funds have negative skewness and excess kurtosis.
  - The purchase of S&P 500 put options can reduce downside risk and higher moments exposures.

# Literature Review

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- Bilson and Cernauskas, 2004
  - Tests the interdependence between currency prices and interest rates.
  - Similar methodology can be used for VIX and SPX.

# The Problem?

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- Each of the prior studies used cash VIX, an untradeable asset.
- VIX Futures started in March 2004, so we can now analyze three years of futures market data, and compare VIX futures to VIX cash.

# Empirical Cash Returns

- Annualized daily returns, Mar 2004-Mar 2007

	Mean	StDev	Skewness	Kurtosis
SPX	8.86%	10.48%	-.19	.26
VIX	-8.05%	95.92%	2.16	19.02
SPX+ VIX	12.38%	6.91%	1.90	16.19

	– Terminal Wealth	Min Day Return	Max Day Return
SPX	128.93%	- 3.47%	2.16%
VIX	77.78%	-25.91%	64.22%
SPX+ VIX	141.79%	- 1.38%	4.56%

# Empirical Futures Returns

- Annualized daily returns, Mar 2004-Mar 2007
- Use nearest term futures contracts

	Mean	StDev	Skewness	Kurtosis
■ SPX	7.19%	10.51%	-.43	1.92
■ VIX	-66.44%	56.65%	1.90	43.39
■ SPX+ VIX	-4.65%	8.16%	0.44	22.00

	– Terminal Wealth	Min Day Return	Max Day Return
■ SPX	123.09%	- 3.94%	2.13%
■ VIX	3.81%	-31.65%	41.81%
■ SPX+ VIX	86.73%	- 1.63%	1.27%

# Initial Impressions

- VIX Cash and VIX futures have very different behavior
  - Correlation of daily change(Cash VIX, VIX F1) = 0.692
  - Correlation of daily change(Cash VIX, VIX F2) = 0.748
- The large risk premium prevents cost effective hedging of equity portfolios
  - Monthly risk premium –4.87% to hold VIX futures relative to VIX cash
  - Three year terminal wealth of cash VIX 77.78% vs. VIX futures 3.81%
- Futures are less volatile than the cash
  - Stdev(VIX F1)/Stdev(VIX Cash) = 59.1%
  - Stdev(VIX F2)/Stdev(VIX Cash) = 33.2%

# The Cash-Futures Basis

- VIX Cash and Futures are Mean Reverting
- Traders are reluctant to sell VIX Futures at very low levels or buy VIX Futures at very high levels
- Change in Basis can overwhelm change in cash
- In four weeks, VIX Cash could +0.65 and VIX futures could –0.55 if settlement at 11.50%
- January 18, 2007      VIX Cash = 10.85%
- Futures Prices
  - Feb 2007                      12.05                      Mar 2007                      12.90
  - April 2007                      13.44                      May 2007                      14.01
  - June 2007                      14.64                      Aug 2007                      15.08
  - Nov 2007                      15.75                      May 2008                      16.47

# Interdependence of VIX and SPX

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- Correlation of daily change in VIX cash and SPX cash = -0.795
- Correlation of daily change in front month futures of VIX vs. SPX = -0.651
- Largely a coincident relationship

# Testing for Interdependence

- $R_{s,t} = \alpha_s + \beta_{1s} X_{s,t-1} + \beta_{2s} X_{v,t-1} + \varepsilon$
- $R_{v,t} = \alpha_v + \beta_{1v} X_{s,t-1} + \beta_{2v} X_{v,t-1} + \varepsilon$ 
  - Where  $X_s$  is the difference in price between the front and second contract of the SPX futures, and  $X_v$  is the price difference between the front and second contract of the VIX futures. The markets are independent if  $\beta_{2s}$  and  $\beta_{2v}$  are not significantly different from zero.

# Testing for Interdependence

- $R_{s,t} = \alpha_s + \beta_{1s} X_{s,t-1} + \beta_{2s} X_{v,t-1} + \varepsilon$
- $R_{v,t} = \alpha_v + \beta_{1v} X_{s,t-1} + \beta_{2v} X_{v,t-1} + \varepsilon$
- $\beta_{1s} = .041$  ( $p=0.58$ )     $\beta_{2s} = .013$  ( $p=0.004$ )     $R^2 = .011$
- $\beta_{1v} = .130$  ( $p=0.74$ )     $\beta_{2v} = -.121$  ( $p=0.000$ )     $R^2 = .033$ 
  - VIX Futures Calendar Spread helps predict both SPX and VIX futures daily returns

# Testing for Interdependence

- $R_{S,t} = \alpha_s + \beta_{1s} X_{S,t-1} + \beta_{2s} X_{V,t-1} + \beta_{3s} R_{S,t-1} + \beta_{4s} \text{VIX Cash}_{,t-1} + \varepsilon$
- $R_{V,t} = \alpha_v + \beta_{1v} X_{S,t-1} + \beta_{2v} X_{V,t-1} + \beta_{3v} R_{V,t-1} + \beta_{4v} \text{VIX Cash}_{,t-1} + \varepsilon$
- $\beta_{1s} = .325$  ( $p=0.000$ )       $\beta_{2s} = .028$  ( $p=0.000$ )
- $\beta_{3s} = .017$  ( $p=0.644$ )       $\beta_{4s} = .0008$  ( $p=0.000$ )  $R^2 = .050$
- $\beta_{1v} = -.682$  ( $p=0.15$ )       $\beta_{2v} = -.177$  ( $p=0.000$ )
- $\beta_{3v} = -.140$  ( $p=0.000$ )       $\beta_{4v} = -.002$  ( $p=0.003$ )  $R^2 = .070$ 
  - VIX level and calendar spread predict SPX futures return
  - VIX level, calendar spread, and yesterday's VIX return predict SPX futures return

# Conclusion

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- In a low volatility environment, it is expensive to hold VIX futures.
- The futures-cash basis is large, as the market anticipates higher future volatility
- There can be substantial benefits to short futures positions in a continued low volatility environment.
- When the level and shape of the volatility curve changes, the volatility risk premium also changes.
- Average VIX futures price = 15.90
- Average VIX cash price = 14.11
- Average futures-cash basis = 1.79