

# Variance Swaps

MS&E 345 Advanced Topics in Financial  
Engineering

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**MS&E** | DEPARTMENT OF MANAGEMENT  
SCIENCE AND ENGINEERING

## Part I: Background

- Introduction to Variance Swaps
- Pricing Intuition
- The Variance Swap Market

## Part II: Replication and Pricing

## Part III: Variance Swap Strategies



## Part I: Background

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## Part II: Replication and Pricing

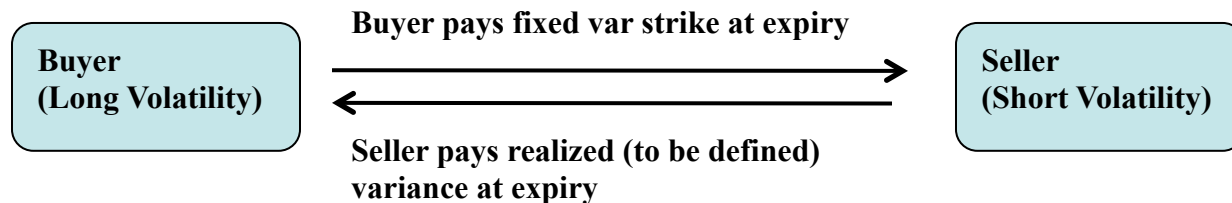
## Part III: Variance Swap Strategies



## 4 Introduction to Variance Swaps

- The Product

- Offers direct and “simple” exposure to the volatility of an underlying asset



- Liquid across major equity indices and some large-cap stocks
- Used for various purposes:
  - Take a volatility view (Long or Short)
  - Diversify returns
  - Trade forward volatility, correlation, dispersion
- Replication:
  - Exact replication by an infinite continuous portfolio of vanilla options
  - In practice, hedged with a “small” number of options
  - Pricing reflects volatilities across the entire skew surface
  - In practice, VSwaps trade at a slight premium to ATM implied volatilities



# 5 Introduction to Variance Swaps

- The VSwap contract

- OTC product: Two parties agree to enter into a swap with maturity T
  - The buyer of the swap receives realized variance,  $\sigma^2$ , over the life of the contract at date T
  - The seller of the swap receives a fixed pre-determined strike  $K^2$  at date T. The strike reflects market estimates of future volatility (implied volatility) at time t.

$$payoff_{(long)} = h(T) = N_{Var} (\sigma^2 - K^2) = \frac{N_{Vega}}{2K} (\sigma^2 - K^2)$$

*$N_{Vega}$  represents the average profit/loss for a 1% (1 vega) change in volatility*

- Measuring realized variance and volatility

- Issues
  - Frequency of sampling: hourly? Daily? Intraday? Weekly? Time-period?
- Actual method used: “RMS” (Root-Mean-Squared) = ignore mean
  - Simplifies calculation (a little), error made not too big, mean is typically around zero

$$\sigma^2 = \frac{252}{N} \sum_{i=1}^N \left[ \ln\left(\frac{S_i}{S_{i-1}}\right) \right]^2$$

where  $S_i$  is the price of the underlying at closing and N is the number of trading days during the length of the contract.



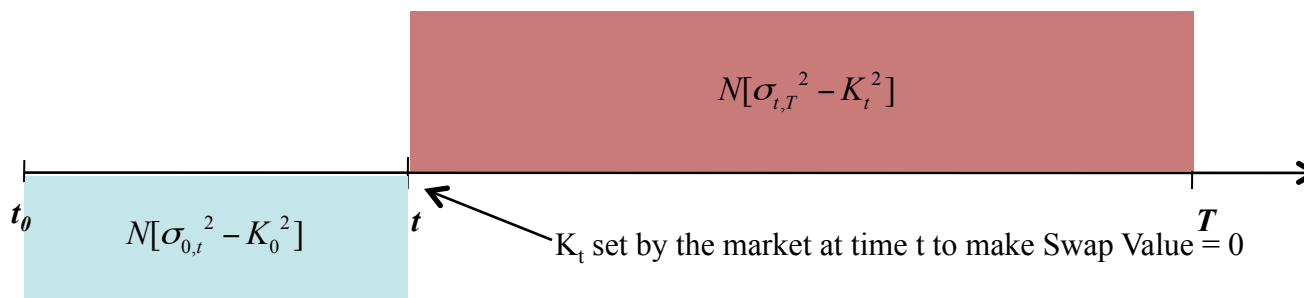
# VSwap Mark-to-Market

- Variance is additive, which simplifies the MTM, we need:

- Realized variance since the start of the swap
- Implied variance (new Strike) from  $t$  until expiry  $T$
- Additivity equation:

$$(T - t_0) \text{var}_{t_0 \rightarrow T}(S) = (t - t_0) \text{var}_{t_0 \rightarrow t}(S) + (T - t) \text{var}_{t \rightarrow T}(S) \Rightarrow \begin{cases} t_0 = 0 \\ \text{var}_{t_0 \rightarrow T}(S) = \sigma_{0,T}^2 \\ \text{var}_{t_0 \rightarrow t}(S) = \sigma_{0,t}^2 \\ \text{var}_{t \rightarrow T}(S) = \sigma_{t,T}^2 \end{cases} \Rightarrow \begin{cases} \sigma_{0,T}^2 = \lambda \sigma_{0,t}^2 + (1 - \lambda) \sigma_{t,T}^2 \\ \text{with } \lambda = \frac{t}{T} \end{cases}$$

$$\text{Payoff}(0, T) = N[\sigma_{0,T}^2 - K_0^2] \Rightarrow PV(t, T) = Ne^{-r(T-t)} \{ [\sigma_{t,T}^2 - K_t^2] \lambda + [K_t^2 - K_0^2] (1 - \lambda) \}$$



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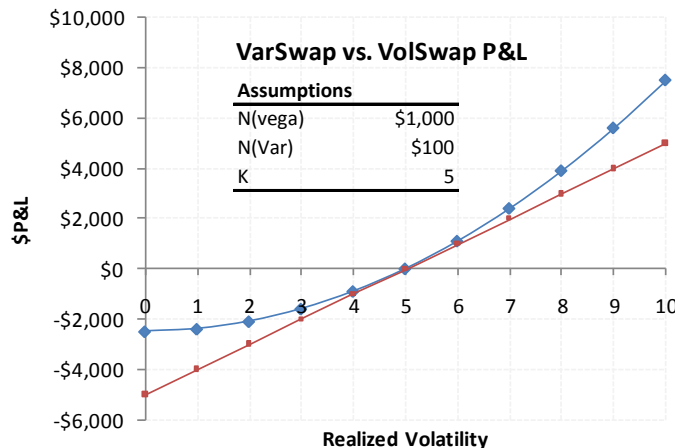
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# Pricing Intuition

- The strike  $K$ , reflects the market's best guess of future volatility but with a premium (actually 2 premiums)
  - Convexity premium:
    - Variance swaps are convex in volatility: The gain from an increase in volatility is greater in absolute terms than the loss from the corresponding decrease
    - To take this into account, traders charge a premium to the ATM implied volatilities



Real. Vol	Real. Var	P&L	
		VarSwap	VolSwap
0	0	-\$2,500	-\$5,000
1	1	-\$2,400	-\$4,000
2	4	-\$2,100	-\$3,000
3	9	-\$1,600	-\$2,000
4	16	-\$900	-\$1,000
5	25	\$0	\$0
6	36	\$1,100	\$1,000
7	49	\$2,400	\$2,000
8	64	\$3,900	\$3,000
9	81	\$5,600	\$4,000
10	100	\$7,500	\$5,000

- Volatility risk premium (replication premium):
  - Theoretical price calculated from prices of replicating options, so the strike  $K$  can be thought of a weighted average of vanilla option implied vols. In the presence of skew and skew convexity, avg. vols will usually be above ATM vol, making the VSwap more expensive.
- VSwaps usually trade 1-2 vegas above ATM volatility





# Outline of Presentation

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# The Variance Swap Market

- First mentioned in the 1990's – took off early 2000's
  - Mostly on index underlyings, EURO STOXX 50, S&P 500
  - Also on large-cap constituents allowing for dispersion trades
- Steady growth over past few years
  - Marketed as an alternative to options without path dependence issues and transaction costs resulting from delta-hedging
- Significant increases in liquidity
  - Variance swaps moved from exotics desks into flow-trading
  - Bid/offer spreads on indices at around 0.4 vegas, 1-2 on single-names
  - Liquid maturities ranging from 3 months to 2 years
  - VIX represents theoretical prices of VSwaps on S&P
  - Around 30% of the vega traded in the market is done so via Vswaps
- Less liquidity in other assets (bonds, fx, commodities)
  - In theory, this should change



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- Replicating a Variance Swap
- The Fair Strike
- Numerical Application

## Part III: Variance Swap Strategies



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# Delta Hedging in Black-Scholes

- P/L over small price movement, in terms of gamma

$$\begin{aligned}
 & [C(S + dS) - C_S(S)(S + dS)] - [C(S) - C_S(S)S] \\
 &= C_S dS + \frac{1}{2} C_{SS} dS^2 - C_S dS + O(dS^3) \\
 &\approx \frac{1}{2} C_{SS} dS^2 = \frac{1}{2} \Gamma dS^2
 \end{aligned}$$

- Dollar gamma

- Dollar gamma measure P/L in terms of return

$$\$ \Gamma = \Gamma S^2 / 100$$

- P/L in terms of dollar gamma: connection to return

$$P / L = \frac{1}{2} \Gamma dS^2 = \Gamma S^2 \left( \frac{dS}{S} \right)^2 = 50 \$ \Gamma R^2$$



# Delta Hedging in Black-Scholes

- There ain't no such thing as a free lunch
  - At the first glance, delta hedge always give positive P/L
  - We have only considered asset price's movement, omitting the theta

$$\theta = C_t = -\frac{1}{2} \Gamma S^2 \sigma^2 \quad (\text{We assume zero risk free rate})$$

- P/L with theta

$$P / L = \frac{1}{2} \Gamma dS^2 + \theta dt = \frac{1}{2} \Gamma S^2 [R^2 - \sigma^2 dt] = 50\$ \Gamma [R^2 - \sigma^2 dt]$$

- **Realised volatility**

- What is return:  $1+R=(S+dS)/S=S_{dt}/S_0$
- What is realised volatility: (assume dt is 1 day)

$$\sigma_{real}^2 = 252[\ln(S_{dt} / S_0)]^2 = 252[\ln(1 + R)]^2 \approx 252 R^2$$

$$R^2 = \sigma_{real}^2 dt \Rightarrow P / L = 50\$ \Gamma dt (\sigma_{real}^2 - \sigma^2)$$



# 15 Delta Hedging v.s. Variance Swap

- **Delta hedging and variance swap are similar**
  - If realised volatility is higher than implied volatility, delta hedging gains. Otherwise, delta hedging loses money.
  - If realised volatility is higher than the strike, variance swap gains. Otherwise, variance swap loses money.
- **Delta hedging and variance swap are different**
  - Delta hedging
    - For high dollar gamma (asset price close to strike), the option has high exposure to spread between implied and realised volatilities.
    - For low dollar gamma (asset price far away from the strike), the option has little exposure to volatilities.
    - Such exposure to volatility is path dependent.
  - Variance swap
    - Whatever the price the underlying asset has, variance swap has constant exposure to the spread between realised and strike volatilities.
    - Such exposure to volatility is path independent



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# Replicating a Variance Swap

- General idea of replicating variance swap

- P/L of variance swap:

$$\text{const} \times (\sigma_{real}^2 - \sigma_{Strike}^2)$$

- P/L of delta hedging:

$$\text{variable} \times (\sigma_{real}^2 - \sigma_{impl}^2)$$

- Replicating: choose proper weights of options, to achieve constant gamma.

- A mathematical point of view

- What price function has constant dollar gamma

- Suppose the price is  $C(S)$ :

- Gamma is:  $\Gamma = C_{SS}$

- Dollar gamma is:  $\$ \Gamma = \Gamma S^2 / 100 = C_{SS} S^2 / 100 = \text{constant}$

$$C(S) = -a \ln(S) + bS + c$$

- Payoff of the constant dollar gamma portfolio at T:

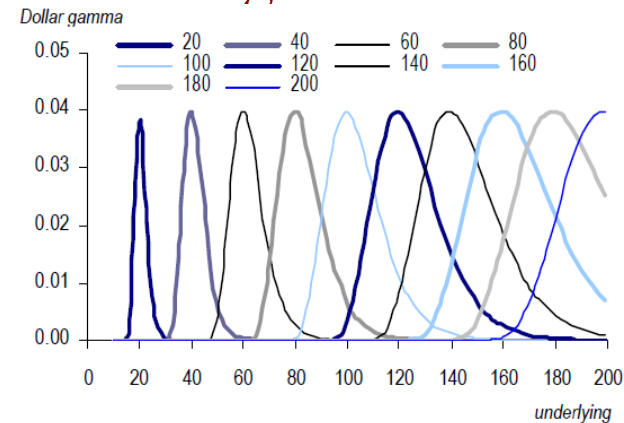
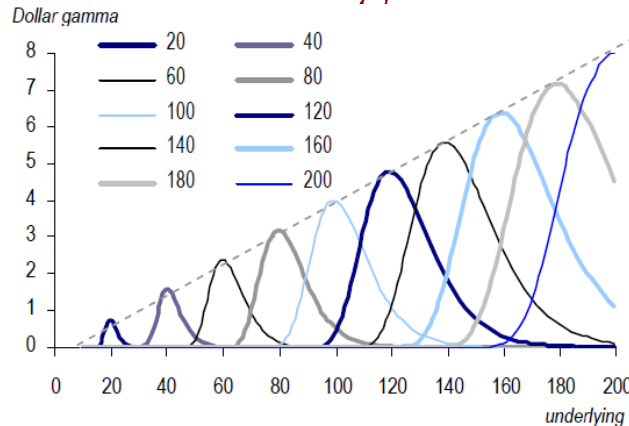
$$-a \ln(S_T) + bS_T + c$$

- Dollar gamma is:  $\$ \Gamma = \Gamma S^2 / 100 = C_{SS} S^2 / 100 = a: a > 0$

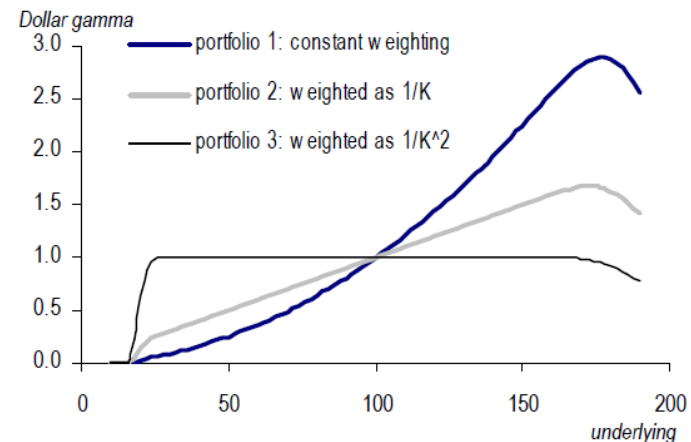
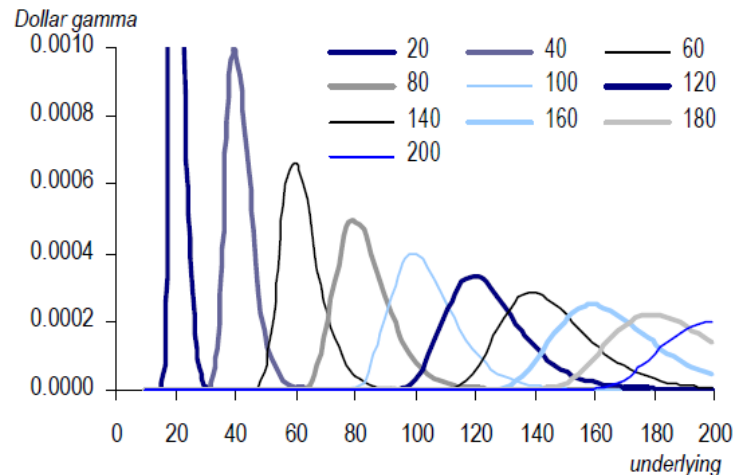


# Replicating a Variance Swap

- Constant weighted case v.s.  $1/K$ -weighted case



- $1/K^2$ -weighted case & Aggregate dollar gamma



# Replicating a Variance Swap

- Use payoffs of vanilla options to construct such payoff:

$$\int_0^{S_0} \frac{(K - S_T)^+}{K^2} dK + \int_{S_0}^{\infty} \frac{(S_T - K)^+}{K^2} dK = \int_{S_0}^{S_T} \frac{S_T - K}{K^2} dK$$

$$= -\ln(S_T) - \frac{1}{S_0} S_T + \ln(S_0) - 1$$

- **Conclusion:**
  - We can construct a portfolio of calls and puts initially, weighted as  $1/\text{strike-squared}$ , and such portfolio has constant dollar gamma
  - This is a static portfolio, no dynamic trading of options is required.
- It is not commonly used in practice. Why?



# Replicating a Variance Swap

- Other possibilities to construct constant dollar gamma portfolio
  - Use a single vanilla option, buy or sell over time, to keep constant dollar gamma.
    - Dynamic trading is needed
    - The position could end up with enormous amounts of the option.
  - Start with an ATM option, and on each re-hedging step, either sell or hold the previous option, and buy an amount of new ATM to achieve constant dollar gamma
    - Still, dynamic trading of options is needed
  - However, such portfolios are actually used in practice
- Drawbacks of theoretical portfolio
  - Traded strikes are not continuous
  - Lack of liquidity in OTM strikes, especially for puts
- We just use the theoretical model for a fair price



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# Derive the Strike

- Ito's formula

- For arbitrary smooth  $f(S)$

$$f(S_T) - f(S_0) = \int_0^T f'(S_t) dS_t + \int_0^T \frac{1}{2} S_t^2 f''(S_t) \sigma_t^2 dt$$

- Assume

$$f(S_t) = \frac{2}{T} \left[ \ln\left(\frac{S_0}{S_t}\right) + \frac{S_t}{S_0} - 1 \right] \Rightarrow f''(S_t) = \frac{2}{TS_t^2}$$

- Average realised variance:

$$\begin{aligned} \frac{1}{T} \int_0^T \sigma_t^2 dt &= \frac{2}{T} \left[ \ln\left(\frac{S_0}{S_T}\right) + \frac{S_T}{S_0} - 1 \right] - \frac{2}{T} \int_0^T \left[ \frac{1}{S_0} - \frac{1}{S_t} \right] dS_T \\ &= \frac{2}{T} \int_0^{S_0} \frac{(K - S_T)^+}{K^2} dK + \frac{2}{T} \int_{S_0}^{\infty} \frac{(S_T - K)^+}{K^2} dK - \frac{2}{T} \int_0^T \left[ \frac{1}{S_0} - \frac{1}{S_t} \right] dS_T \end{aligned}$$



# Derive the Strike

- Fair strike:

$$K_{VAR}^2 = \frac{2e^{rT}}{T} \left[ \int_0^{S_0} \frac{P_0(K)}{K^2} dK + \int_{S_0}^{\infty} \frac{C_0(K)}{K^2} dK \right]$$

- The last term in realised volatilities
  - It is equivalent as holding  $1/S_t - 1/S_0$  units of underlying asset at time  $t$ .
  - Initially, no underlying asset is needed.
- Strike calculation in practice
  - Use discrete strike values

$$K_{VAR}^2 = \frac{2e^{rT}}{T} \left[ \sum_{K_i \leq S_0} \frac{\Delta K_i}{K_i^2} P_0(K_i) + \sum_{K_i > S_0} \frac{\Delta K_i}{K_i^2} C_0(K_i) \right] - \frac{1}{T} \left( \frac{S_0}{K_0} - 1 \right)^2$$



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# A Real Life Application

- Underlying asset price: \$2,935.02
- Chosen strikes: equally apart, every 5% steps
- Calculated strike for variance swap: 16.625%
- Variance notional: 10,000

**Floating leg:**  
**€2,701,397.53**

**Fixed leg:**  
**€2,701,355.88**

**Present value:**  
**≈ 0**

Weight = 5% Strike% <sup>2</sup>	Under- lying	Call / Put	Forward	Strike	Strike (%Forward)	Maturity	Implied Volatility	Price (%Notional)
20.00%	SX5E	P	2,935.02	1,467.51	50%	1Y	27.6%	0.04%
16.53%	SX5E	P	2,935.02	1,614.26	55%	1Y	26.4%	0.08%
13.89%	SX5E	P	2,935.02	1,761.01	60%	1Y	25.2%	0.15%
11.83%	SX5E	P	2,935.02	1,907.76	65%	1Y	24.0%	0.27%
10.20%	SX5E	P	2,935.02	2,054.51	70%	1Y	22.7%	0.46%
8.89%	SX5E	P	2,935.02	2,201.26	75%	1Y	21.4%	0.75%
7.81%	SX5E	P	2,935.02	2,348.01	80%	1Y	20.0%	1.17%
6.92%	SX5E	P	2,935.02	2,494.76	85%	1Y	18.7%	1.79%
6.17%	SX5E	P	2,935.02	2,641.51	90%	1Y	17.3%	2.67%
5.54%	SX5E	P	2,935.02	2,788.26	95%	1Y	16.0%	3.94%
2.50%	SX5E	P	2,935.02	2,935.02	100%	1Y	14.8%	5.74%
2.50%	SX5E	C	2,935.02	2,935.02	100%	1Y	14.8%	5.74%
4.54%	SX5E	C	2,935.02	3,081.77	105%	1Y	13.7%	3.37%
4.13%	SX5E	C	2,935.02	3,228.52	110%	1Y	12.9%	1.76%
3.78%	SX5E	C	2,935.02	3,375.27	115%	1Y	12.2%	0.81%
3.47%	SX5E	C	2,935.02	3,522.02	120%	1Y	11.9%	0.35%
3.20%	SX5E	C	2,935.02	3,668.77	125%	1Y	11.8%	0.15%
2.96%	SX5E	C	2,935.02	3,815.52	130%	1Y	11.9%	0.06%
2.74%	SX5E	C	2,935.02	3,962.27	135%	1Y	12.1%	0.03%
2.55%	SX5E	C	2,935.02	4,109.02	140%	1Y	12.5%	0.02%
2.38%	SX5E	C	2,935.02	4,255.77	145%	1Y	12.9%	0.01%
2.22%	SX5E	C	2,935.02	4,402.52	150%	1Y	13.4%	0.01%



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- Uses of Variance Swaps
- Rolling Short Variance



# Uses of Variance Swaps

- Express local or macro volatility view
  - Buy Swap on Index ahead of recession, sell vol into a spike
  - Better than straddles because not affected by trending underlying, no path dependence, no active management of delta-hedging needed
- Hedging purposes
  - Volatility tends to go up in a slumping market
- Rolling short variance
  - Strategy consists of selling short-dated index variance
  - This is to try and take advantage of the volatility risk premium described earlier
- Diversification
- Index Variance spreads (Vol on S&P 500 vs. EuroStoxx)
- Single-Stock volatility pairs trading
- Correlation and dispersion trading (long index, short basket)
- And many many other....



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- Uses of Variance Swaps

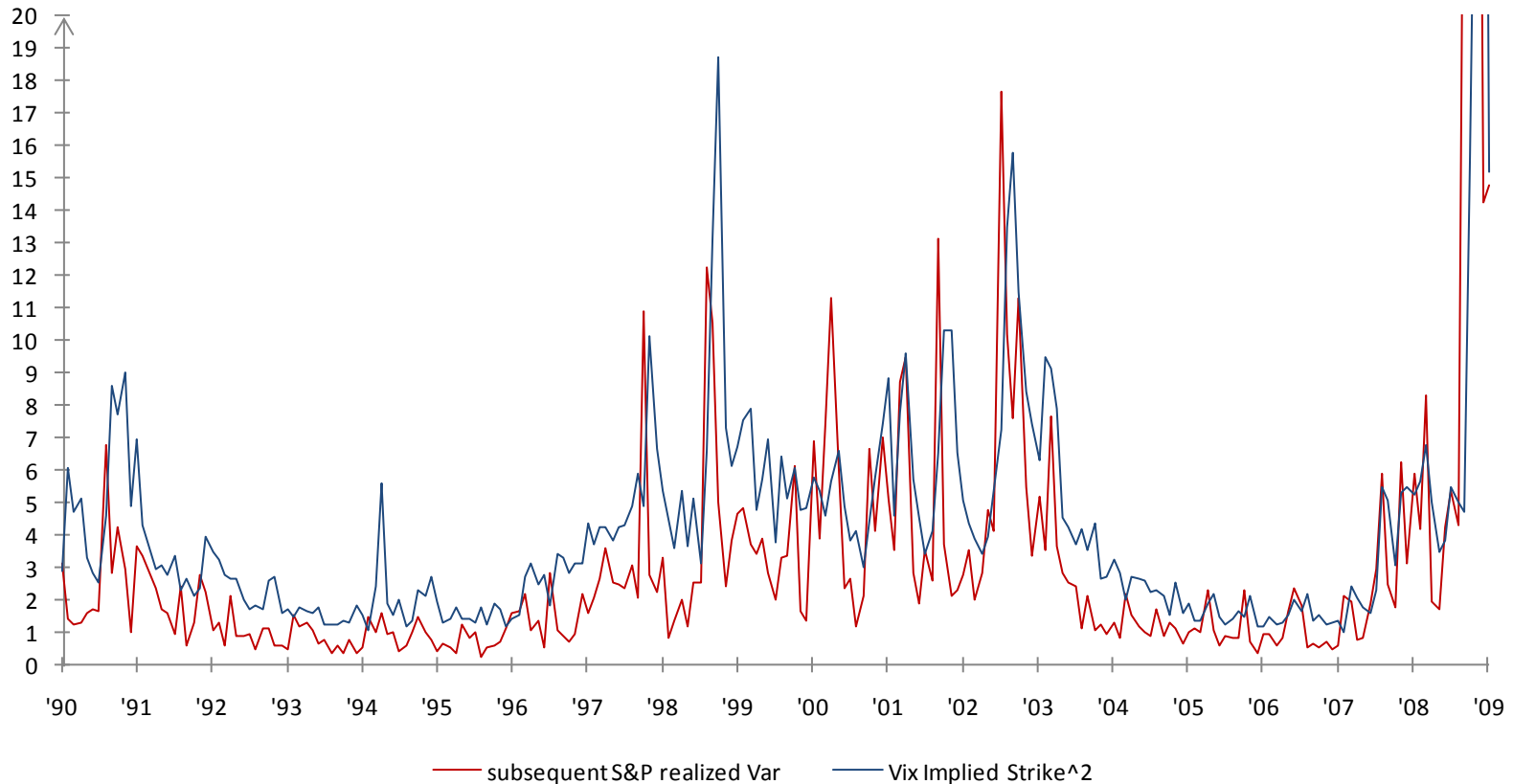
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- Rolling Short Variance

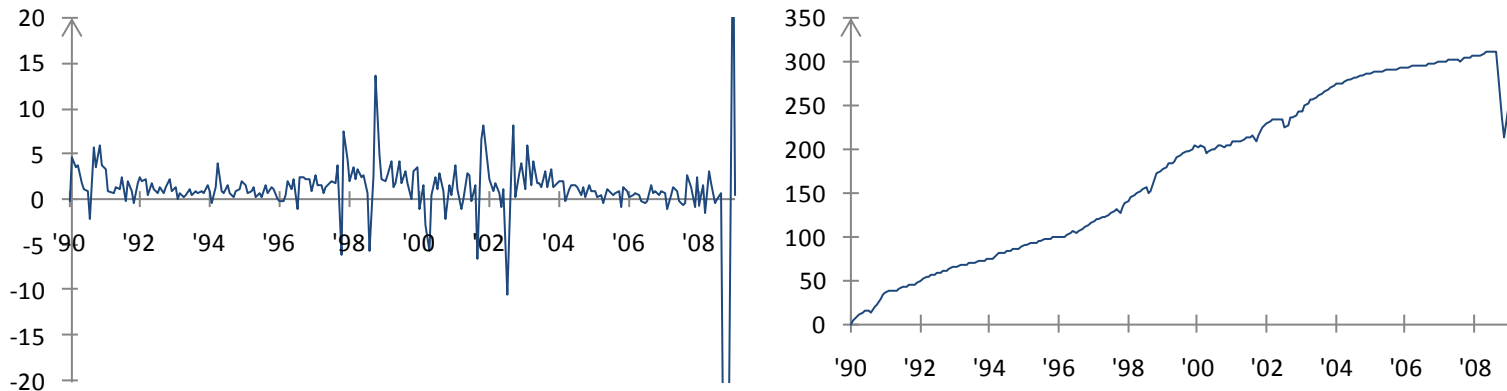


# Rolling Short Variance

- Idea: Take advantage of premiums embedded in Vswap
  - Volatility Risk Premium and Convexity Premium
- Short N=\$1 Variance Swap at start of each month
- Implied strike taken from VIX in graph below => Actual P&L will be higher



# Rolling Short Variance



	'90-'09	'90-'07
Total Months	229	214
% Positive	83.84%	79.91%
% Negative	16.16%	20.09%
Average Return (monthly)	1.09%	1.41%
Largest monthly Return	32.42%	13.73%
Largest monthly Loss	-49.92%	-10.42%
Stdev	5.14%	2.25%

- Note: this example is a conservative estimate
  - Using VIX bid-side instead of actual VS Strikes
  - Not reinvesting gains / accounting losses for tax purposes



# End of Presentation

- Questions?

