

Delayed Heston Model:  
Improvement of Vol Surface  
and  
Hedging of Vol Swaps

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## Outline of Presentation

1. Delayed Heston Model: Motivation & Definition
2. Delayed Heston Model: Improvement of Volatility Surface
3. Delayed Heston Model: Variance and Volatility Swaps
4. Delayed Heston Model: Hedging Volatility Swaps
5. Conclusion

## Classical Heston Model

The [Heston model](#) is one of the most popular stochastic volatility models in the industry, as semi-closed formulas for vanilla option prices are available, few (five) parameters need to be calibrated, and it accounts for the mean-reverting feature of the volatility:

$$\begin{cases} dS_t = rS_t dt + \sqrt{V_t} S_t dW_t^Q \\ dV_t = [\gamma(\theta^2 - V_t)] dt + \delta \sqrt{V_t} dW_t^Q, \end{cases}$$

where  $S_t$  is a stock price,  $V_t$  is the stochastic variance,  $W_t^Q$  is the Wiener process with respect to the the risk-neutral probability  $Q$  and  $r$  is the interest rate.

## Delayed Heston Model

- **Motivation:** to include past history (a.k.a. delay) of the variance (over some delayed time interval  $[t - \tau, t]$ )
- **Advantage:** Improvement of the Volatility Surface Fitting (44% reduction of the calibration error) compare with Classical Heston model
- **Goal:** to price and hedge volatility swaps

## Delayed Heston Model: Pricing and Hedging of Volatility Swaps (Prose)

We'd like to take into account not only its current state (as it is the case in the Heston model) but also its **past history** over some interval  $[t - \tau, t]$ , where  $\tau$  is a positive constant and is called the delay. Namely, at each time  $t$ , the immediate future volatility at time  $t + \epsilon$  will not only depend on its value at time  $t$  but also on all its history over  $[t - \tau, t]$ .

## Delayed Heston Model: Pricing and Hedging of Volatility Swaps (Prose)

Namely, at each time  $t$ , the immediate future volatility at time  $t + \epsilon$  will not only depend on its value at time  $t$  but also on all its **history** over  $[t - \tau, t]$ . Starting from the well-known discrete-time GARCH(1,1) model, a continuous-time GARCH variance diffusion incorporating delay (let's refer to it as 'delayed vol') was introduced in a paper Sw. (2005). Unfortunately, the latter model doesn't lead to (semi-)closed formulas for the vanilla options, making it difficult to use for practitioners willing to calibrate on vanilla market prices (which can be a serious drawback).

## Delayed Heston Model: Pricing and Hedging of Volatility Swaps (Prose)

Nevertheless, one can notice that the [Heston model and 'delayed vol'](#) are very similar in the sense that the expected values of the variances are the same - when we make the delay tends to 0 in 'delayed vol'. As mentioned before, the Heston framework is very convenient for practitioners, and therefore it is naturally tempting to adjust the Heston dynamics in order to incorporate - in some way - the delay introduced in 'delayed vol'.

## Delayed Heston Model: Pricing and Hedging of Volatility Swaps (Prose)

We considered in a first approach **adjusting the Heston drift** by a deterministic function of time so that the expected value of the variance under our **new delayed Heston model** is equal to the one under 'delayed vol'. Our approach can therefore be seen as a variance 1st moment correction of the Heston model, in order to account for the delay. It is important to note that our model is a generalization of the classical Heston model (the latter corresponding to the zero delay case  $\tau = 0$  of our model).



## Delayed Heston Model: Pricing and Hedging of Volatility Swaps (Prose)

We performed [numerical tests](#) to validate our approach. With recent market data ([Sept. 30th 2011, underlying EURUSD](#)), we performed the model calibration on the whole market vanilla option price surface (14 maturities from 1M to 10Y, 5 strikes ATM, 25 Delta Call/Put, 10 Delta Call/Put). [The results show a significant \(44%\) reduction of the average absolute calibration error compared to the Heston model \(i.e. average of the absolute differences between market and model prices\).](#)

## **Delayed Heston Model: Pricing and Hedging of Volatility Swaps (Prose)**

Further, we considered [variance and volatility swaps hedging and pricing in our delayed Heston framework](#). These contracts are widely used in the financial industry and therefore it is relevant to know their price processes (how much they worth at each time  $t$ ) and how we can hedge a position on them, i.e. theoretically cancel the risk inherent to holding one unit of them.

## Delayed Heston Model: Pricing and Hedging of Volatility Swaps (Prose)

Using the fact that every continuous local martingale can be represented as a time-changed Brownian motion, as well as the Brockhaus & Long approximation (that allows to approximate the expected value of the square-root of an almost surely non negative random variable using a 2nd order Taylor expansion approach), we were able to [derive closed formulas for variance and volatility swaps price processes](#).

## Delayed Heston Model: Pricing and Hedging of Volatility Swaps (Prose)

In addition, as variance swaps are relatively liquid instruments in the market (i.e. they can be easily bought and sold), we considered the [question of hedging a position on a volatility swap using variance swaps in our framework](#).

We were able to derive a closed formula for the [dynamic hedge ratio](#), i.e. the number of units of variance swaps to hold at each time in order to hedge a position on a volatility swap.

## Delayed Heston Model: Pricing and Hedging of Volatility Swaps (Formulas)

- **Motivation**: past history of the variance in its diffusion (over some delayed time interval  $[t - \tau, t]$ )
- Non-Markov continuous-time GARCH model (Sw. (2005))

$$\frac{dV_t}{dt} = \gamma(\theta^2 - V_t) + \alpha \left[ \frac{1}{\tau} \left( \int_{t-\tau}^t \sqrt{V_s} dZ_s^Q - (\mu - r)\tau \right)^2 - V_t \right]$$

- 

$$\begin{cases} dV_t &= [\gamma(\theta^2 - V_t) + \epsilon_\tau(t)]dt + \delta\sqrt{V_t}dW_t^Q \\ \epsilon_\tau(t) &:= \alpha \left[ \tau(\mu - r)^2 + \frac{1}{\tau} \int_{t-\tau}^t E^Q(V_s)ds - E^Q(V_t) \right]. \end{cases}$$

We note, that  $\lim_{\tau \rightarrow 0} \sup_{t \in \mathbb{R}_+} |\epsilon_\tau(t)| = 0$ .

## Delayed Heston Model: Pricing and Hedging of Volatility Swaps (Formulas)

### *Calibration Results*

- Semi-closed formulas available for [call options](#)
- [September 30th 2011](#) for underlying [EURUSD](#) on the whole volatility surface (14 maturities from 1M to 10Y, 5 strikes: ATM, 25D call/put, 10D call/put)
- [44%](#) reduction of the average absolute calibration error: 46bp for delayed Heston, 81bp for Heston

## Delayed Heston Model: Pricing and Hedging of Volatility Swaps (Formulas)

### *Variance & Volatility Swaps Pricing*

- Realized variance:  $V_R := \frac{1}{T} \int_0^T V_s ds$
- $K_{var} = E^Q[V_R]$ ,  $K_{vol} = E^Q[\sqrt{V_R}]$
- Brockhaus & Long approximation:  $E[\sqrt{Z}] \approx \sqrt{E[Z]} - \frac{Var[Z]}{8E[Z]^{3/2}}$

## Delayed Heston Model: Pricing and Hedging of Volatility Swaps (Formulas)

### *Variance & Volatility Swaps Pricing*

- Using time-changed Brownian motion representation for continuous local martingales, we get closed formula for VarSwap and VolSwap fair strikes

- $x_t := -(V_0 - \theta_\tau^2)e^{\gamma - \gamma_\tau t} + e^{\gamma t}(V_t - \theta_\tau^2)$

- $dx_t = f(t, x_t)dW_t^Q, \quad x_t = \hat{W}_{T_t}, \quad T_t = \langle x \rangle_t = \int_0^t f^2(s, x_s)ds$



## Delayed Heston Model: Pricing and Hedging of Volatility Swaps (Formulas)

### Variance & Volatility Swaps Pricing

- $\theta_\tau^2 := \theta^2 + \frac{\alpha\tau(\mu-r)^2}{\gamma}, \quad \gamma_\tau := \alpha + \gamma + \frac{\alpha}{\gamma\tau}(1 - e^{-\gamma\tau})$
- $V_t = \theta_\tau^2 + (V_0 - \theta_\tau^2)e^{-\gamma_\tau t} + e^{-\gamma t}\widehat{W}_{T_t} = E^Q[V_t] + e^{-\gamma t}\widehat{W}_{T_t}$

The parameter  $\theta_\tau^2$  can be interpreted as the **delayed-adjusted long-range variance**. We note, that  $\theta_\tau^2 \rightarrow \theta^2$  as  $\tau \rightarrow 0$ .

The parameter  $\gamma_\tau$  can be interpreted as the **delayed-adjusted mean-reverting speed**. We note, that  $\gamma_\tau \rightarrow \gamma$  as  $\tau \rightarrow 0$ .

## Delayed Heston Model: Pricing and Hedging of Volatility Swaps (Formulas)

### *Volatility Swap Hedging*

- Price Processes:
- **VarSwap**:  $X_t(T) := E_t^Q[V_R]$ ,
- **VolSwap**:  $Y_t(T) := E_t^Q[\sqrt{V_R}]$ ,
- $V_R := \frac{1}{T} \int_0^T V_s ds$

## Delayed Heston Model: Pricing and Hedging of Volatility Swaps (Formulas)

- Portfolio containing 1 VolSwap and  $\beta_t$  VarSwaps:

$$\Pi_t = e^{-r(T-t)} [Y_t(T) - K_{vol} + \beta_t (X_t(T) - K_{var})]$$

- If  $I_t := \int_0^t V_s ds$  is the accumulated variance at time  $t$ , then:

$$\begin{aligned} X_t(T) &= E_t^Q \left[ \frac{I_t}{T} + \frac{1}{T} \int_t^T V_s ds \right] := g(t, I_t, V_t) \\ Y_t(T) &= E_t^Q \left[ \sqrt{\frac{I_t}{T} + \frac{1}{T} \int_t^T V_s ds} \right] := h(t, I_t, V_t) \end{aligned}$$

## Delayed Heston Model: Pricing and Hedging of Volatility Swaps (Formulas)

### Volatility Swap Hedging

- We compute the infinitesimal variations (using the fact that  $X_t(T)$  and  $Y_t(T)$  are martingales):

$$\begin{aligned}dX_t(T) &= \frac{\partial g}{\partial V_t} \delta \sqrt{V_t} dW_t^Q \\dY_t(T) &= \frac{\partial h}{\partial V_t} \delta \sqrt{V_t} dW_t^Q \\d\Pi_t &= r\Pi_t dt + e^{-r(T-t)} \left[ \frac{\partial h}{\partial V_t} + \beta_t \frac{\partial g}{\partial V_t} \right] \delta \sqrt{V_t} dW_t^Q\end{aligned}$$

⇒

$$\beta_t = -\frac{\frac{\partial h}{\partial V_t}}{\frac{\partial g}{\partial V_t}} = -\frac{\frac{\partial Y_t(T)}{\partial V_t}}{\frac{\partial X_t(T)}{\partial V_t}}$$

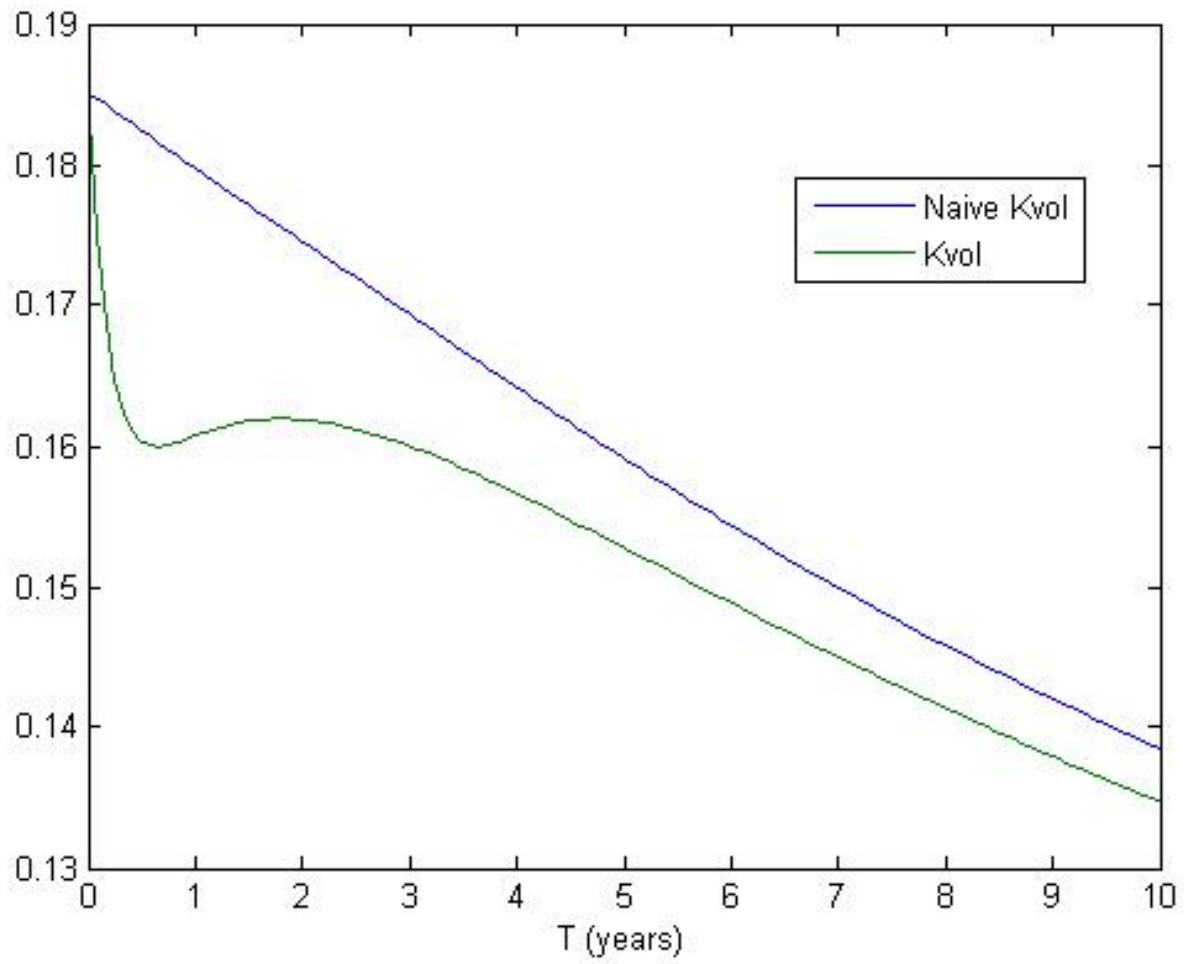
-hedge ratio

## Delayed Heston Model: Pricing and Hedging of Volatility Swaps (Numerical Results)

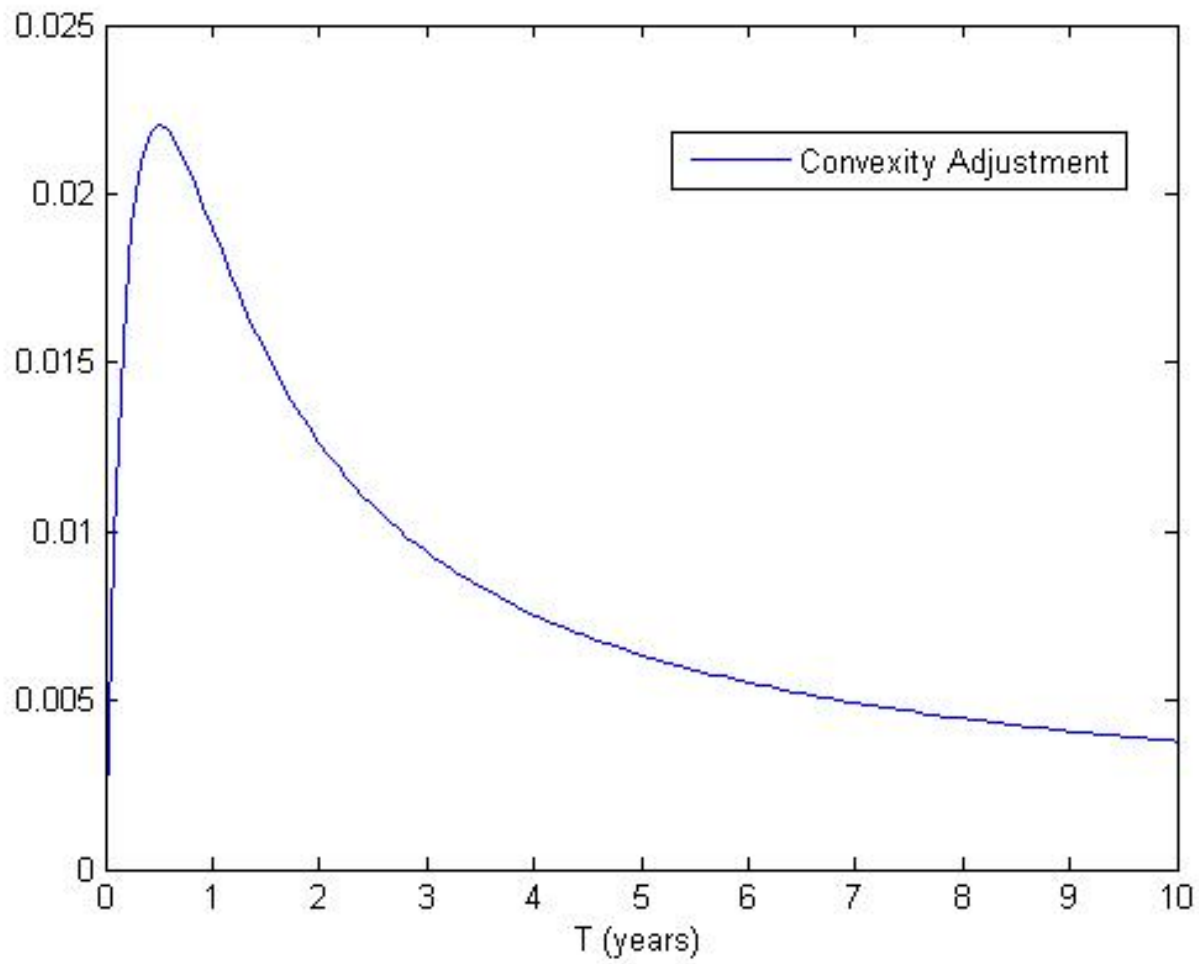
We take the parameters that have been calibrated above (vanilla options on September 30<sup>th</sup> 2011 for underlying EURUSD, maturities from 1M to 10Y, strikes ATM, 25D Put/Call, 10D Put/Call), namely

$$(v_0, \gamma, \theta^2, \delta, c, \alpha, \tau) = (0.0343, 3.9037, 10^{-8}, 0.808, -0.5057, 71.35, 0.7821).$$

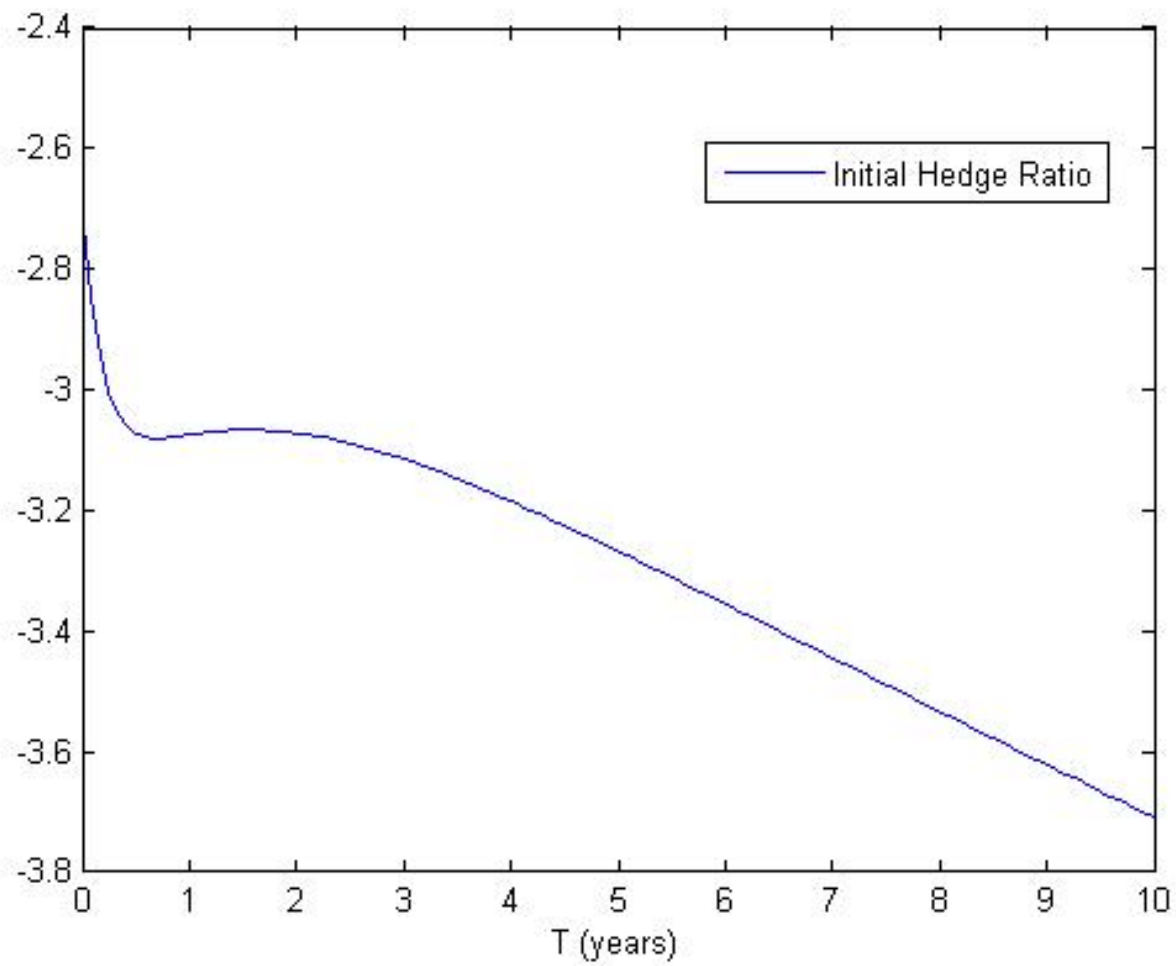
We plot the naive Volatility Swap strike  $\sqrt{K_{var}}$  and the adjusted Volatility Swap strike  $\sqrt{K_{var}} - \frac{Var^Q(V_R)}{8K_{var}^{\frac{3}{2}}}$  along the maturity dimension, as well as the convexity adjustment  $\frac{Var^Q(V_R)}{8K_{var}^{\frac{3}{2}}}$ :



Naive VolSwap vs. Adjusted VolSwap Strikes



Convexity Adjustment



Initial Hedge ratio  $\beta_0(T)$



## **Delayed Heston Model: Pricing and Hedging of Volatility Swaps**

These results had been obtained together with my PhD student Nelson Vadori and have been submitted to Wilmott J. as two papers:

1. 'Delayed Heston Model: Improvement of the Volatility Surface Fitting'
2. 'Pricing and Hedging of Volatility Swap in the Delayed Heston Model: Part 2'

## Conclusion

1. Delayed Heston Model: Motivation & Definition
2. Delayed Heston Model: Improvement of Volatility Surface
3. Delayed Heston Model: Variance and Volatility Swaps
4. Delayed Heston Model: Hedging Volatility Swaps

**The End**

*Thank You for Your Time and Attention!*

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