

Financial products depending jointly on an asset and its volatility: case studies and a theoretical view

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Introduction

In recent times investors have shown interest in financial derivatives/structured products built on the **joint interplay** of an underlying asset (equity) S_t and the **realized volatility** RV_t this same asset accrues over a time period.

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- For a better control and assessment of the **investment risk**;
- To **simplify the valuation framework** in sophisticated market environments;
- To express **joint views** of equity **and** volatility performances;
- To be able to in **trade vanilla type instruments** when markets are under stress, in particular when **high implied volatilities** give rise to unaccessible prices.

We study specific instances of these investments and then move on to a more theoretical valuation approach. Specifically, we will illustrate:

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- 1 The **target volatility option**, a joint asset and volatility derivative written in an **option format**;
- 2 The **target volatility strategy**; a **structured investment strategy** consisting in rebalancing the equity proportion in a portfolio with the volatility it realizes;
- 3 The **valuation problem** of a **general** joint asset/volatility derivative in a **stochastic volatility model**, and produce risk-neutral pricing formulae.

The target volatility option

In a market setting where no interest rate is paid on bonds, let S_t be an equity modeled through a stochastic volatility process σ_t , i.e.:

$$dS_t = \sigma_t S_t dW_t \quad (1)$$

for a Wiener process W_t . The **realized variance** of S_t is the annualized quadratic variation of $X_t = \log S_t$, i.e. the quantity

$$\frac{\langle X \rangle_t}{t} = \frac{1}{t} \int_0^t \sigma_s^2 ds \quad (2)$$

This is the usual continuous-time proxy of the annualized variance of the equity log-returns compounded in $[0, t]$. **We assume also that the processes S_t and σ_t are independent.**

The **realized volatility** RV_t is thus simply $\sqrt{\langle X \rangle_t / t}$.

The target volatility option

The **target volatility option (TVO)** is a European-type derivative contract written on S_t and $\langle X \rangle_t$ paying off at maturity T :

$$TVO_T = \frac{\bar{\sigma}}{RV_T} (S_T - K)^+ = \bar{\sigma} \sqrt{\frac{T}{\langle X \rangle_T}} (S_T - K)^+ \quad (3)$$

for a fixed strike price K and a pre-specified **target volatility level** $\bar{\sigma}$ written in the contract.

We shall show two pricing results for the TVO valuation problem:

- 1 An approximated formula based on a Taylor series expansion of the Black-Scholes call payoff in the variable K around S_0 ;

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- 1 An approximated formula based on a Taylor series expansion of the Black-Scholes call payoff in the variable K around S_0 ;
- 2 A semi-closed integral formula based on the inversion of the Laplace transform of the payoff in the log-strike.

The target volatility option

The **motivation** for such a contract is as follows. Assume that an at-the-money ($K = S_0$) TVO is traded. By taking risk-neutral expectations and using the conditioning trick and the Bachelier approximation for the Call price yields:

$$\mathbb{E} \left[\bar{\sigma} \sqrt{\frac{T}{\langle X \rangle_t}} (S_T - S_0)^+ \right] = \mathbb{E} \left[\left[\bar{\sigma} \sqrt{\frac{T}{\langle X \rangle_t}} (S_T - S_0)^+ \mid \sigma_T \right] \right] \quad (4)$$

$$= \mathbb{E} \left[\sqrt{\frac{T}{\langle X \rangle_t}} C^{BS}(S_0, S_0, \langle X \rangle_t) \right] \sim \mathbb{E} \left[\sqrt{\frac{T}{\langle X \rangle_t}} \frac{\langle X \rangle_t}{\sqrt{2\pi}} \right] = \bar{\sigma} \sqrt{\frac{T}{2\pi}} = \quad (5)$$

$$C^{BS}(S_0, S_0, \bar{\sigma}) \quad (6)$$

that is, the price of an at-the-money TVO having target volatility $\bar{\sigma}$ is **approximately the at-the-money Black-Scholes call price of implied volatility $\bar{\sigma}$** .

What if $K \neq S_0$ ranges in a neighbourhood of S_0 ?

The target volatility option: Taylor series expansion

If we take up equation (4) and let $K \neq S_0$, we see again that **due to independence of S_t and $\langle X \rangle_t$** pricing a TVO is equivalent to pricing the **a volatility derivative** $\sqrt{\frac{T}{\langle X \rangle_t}} C^{BS}(S_0, K, \langle X \rangle_t)$, i.e.:

$$TVO_0 = \mathbb{E} \left[\bar{\sigma} \sqrt{\frac{T}{\langle X \rangle_T}} C^{BS}(S_0, K, \langle X \rangle_T) \right] \quad (7)$$

To obtain a price we proceed as follows:

- 1 We develop $C^{BS}(S_0, K, x)$ as a function of K in its **Taylor series around S_0** and multiply the series thus obtained by the factor $\bar{\sigma} \sqrt{\frac{T}{x}}$;

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- 2 We re-arrange the resulting series **in the variable x** and express it as a series of **converging integrals whose integrand is a real exponential**;

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- 3 We truncate such series, compute it at $x = \langle X \rangle_T$, take the risk neutral expectation, apply Fubini's theorem;
- 4 What we are left with is a **linear combination of integrals of the Laplace transform of the the volatility model proxying the price.**

The target volatility option: Taylor series expansion

Lemma

The Black and Scholes (call) equation admits the following Taylor expansion as a function of the strike K around the ATM point S :

$$C^{BS}(S, K, x) = S - (S + K)N\left(-\frac{\sqrt{x}}{2}\right) + e^{-x/8} \sum_{j=0}^{f(n)} x^{-(1/2+j)} W^{n,j}(K) + O(n+3), \quad (8)$$

where

$$W^{n,j}(K) \equiv \frac{1}{\sqrt{2\pi}} \sum_{k=2j}^n (-1)^k c^{f(k)-j,k} \frac{(K-S)^{k+2}}{S^{k+1}(k+2)!}, \quad (9)$$

and

$$f(k) = \begin{cases} \frac{k}{2}, & k \text{ even;} \\ \frac{k-1}{2}, & k \text{ odd.} \end{cases} \quad (10)$$

The target volatility option: Taylor series expansion

Now we multiply equation (8) by $\bar{\sigma} T / \sqrt{x}$ and make use of the following **integral representations**:

$$\frac{1}{\sqrt{x}} N\left(-\frac{\sqrt{x}}{2}\right) = \frac{1}{2\sqrt{\pi}} \int_0^{\infty} \frac{e^{-(z+1/8)x}}{\sqrt{z+1/8}} dz, \quad (11)$$

and, for $r > 0$:

$$x^{-r} = \frac{1}{r\Gamma(r)} \int_0^{\infty} e^{-z^{1/r}x} dz. \quad (12)$$

By substituting equation (8) into (7), truncating the series, using (11) and (12), and finally passing the expectation inside the integral, we have the following Proposition:

The target volatility option: Taylor series expansion

Proposition

The price of a call TVO can be approximated by a linear combination of integrals of some exponential function of the quadratic variation,

$$C_0^{TV}(K) \approx \bar{\sigma} \sqrt{T} \left[\frac{2S_0}{\sqrt{\pi}} I_0^{1/2,0} - \frac{S_0 + K}{2\sqrt{\pi}} \Phi_0^{1,1/8} + \sum_{j=0}^{f(n)} \frac{W^{n,j}(K)}{(j+1)!} I_0^{j+1,1/8} \right], \quad (13)$$

$$I_0^{r,a} = \int_0^\infty \mathbb{E} \left[e^{\lambda^{r,a}(z) \langle X \rangle_T} \right] dz \quad (14)$$

$$\Phi_0^{r,a} = \int_0^\infty \frac{\mathbb{E} \left[e^{\lambda^{1,1/8}(z) \langle X \rangle_T} \right]}{\sqrt{z + 1/8}} dz, \quad (15)$$

$$\lambda^{r,a}(z) = -(z^{1/r} + a). \quad (16)$$

The target volatility option: Taylor series expansion, $t > 0$

If we want to evaluate the TVO **after inception** $\bar{\sigma}$, i.e. at $t > 0$, equation (7) becomes:

$$TVO_t = \mathbb{E}_t \left[\bar{\sigma} \sqrt{T / (\epsilon_t + \langle X \rangle_T - \langle X \rangle_t)} C^{BS}(S_t, K, \langle X \rangle_t - \langle X \rangle_T) \right] \quad (17)$$

where $\epsilon = \langle X \rangle_t$.

The valuation formula loses its symmetry, because we shall this time multiply equation (8) by $\bar{\sigma} \sqrt{T} / \sqrt{x + \epsilon}$, giving rise in the Taylor development to terms of the form:

$$\frac{N(-\sqrt{x}/2)}{\sqrt{\epsilon + x}}, \frac{x^{-(j+1/2)}}{\sqrt{\epsilon + x}} \quad (18)$$

However, it is possible to use a **second series expansion** and develop the functions $N(-\sqrt{x}/2)$ and $x^{-(j+1/2)}$ **in a neighbourhood of $x + \epsilon$** to restore such symmetry. This will produce a formula similar to (13), but accounting **for a further summation** and the **presence of ϵ** in the coefficients.

Robust pricing

In the influential paper [2], Carr and Lee have proved that volatility derivatives can be statically replicated by claims on the underlying stock. This is thanks to the relation, which holds **under the independence between the stock and volatility** :

$$E_t[e^{\lambda(\langle X \rangle_T - \langle X \rangle_t)}] = E_t \left[e^{(X_T - X_t)p(\lambda)} \right] = E_t \left(\frac{S_T}{S_t} \right)^{p(\lambda)}, \quad (19)$$

for some function p . In turn, this allows for **model-independent (robust)** pricing, that is, prices can be uniquely derived by liquid market data by means of the **Breeden-Litzenberger formula**:

$$f(S) = f(\eta) + f'(k)[S - \eta] + \int_{\eta}^{\infty} f''(x)(S - x)^+ dx + \int_0^{\eta} f''(x)(x - S)^+ dx.$$

where f will be given through use of equation (19).

As it happens their results apply here because **equation (7) involves the pricing of a pure derivative product** .

The target volatility option: Laplace transform method

The TVO can also be priced by using the well-established methodology of the Laplace/Fourier transform inversion pioneered by Heston [6], Lewis [7] and Carr and Madan [1].

We write the **TVO put valuation formula** in terms of the log-strike k :

$$\bar{P}_t(S_t, e^k, \langle X \rangle_t) = \mathbb{E}_t \left[\frac{\bar{\sigma} \sqrt{T}}{\sqrt{\langle X \rangle_T}} (e^k - S_T)^+ \right] \equiv P(k). \quad (20)$$

By Laplace-transforming the put option price in the log-strike we get, for $\text{Re}(\alpha) > 1$:

$$\begin{aligned} \hat{P}_t(\alpha) &\equiv \int_0^\infty e^{-\alpha k} P_t(k) dk \\ &= \bar{\sigma} \sqrt{T} S_t^{1-\alpha} \mathbb{E}_t \left[\frac{1}{\sqrt{\epsilon_t + \langle X \rangle_T - \langle X \rangle_t}} \frac{e^{(1-\alpha)(X_T - X_t)}}{\alpha(\alpha - 1)} \right]. \end{aligned} \quad (21)$$

The target volatility option: Laplace transform method

Again formula (12) comes to rescue us:

$$\frac{1}{\sqrt{\epsilon + x}} = \frac{2}{\sqrt{\pi}} \int_0^{\infty} e^{-z^2(\epsilon+x)} dz. \quad (22)$$

Hence:

$$\begin{aligned} \hat{P}_t(\alpha) &= 2\bar{\sigma} \sqrt{\frac{T}{\pi}} S_t^{1-\alpha} \int_0^{\infty} e^{-z^2 \langle X \rangle_t} E_t \left[\frac{e^{-z^2(\langle X \rangle_T - \langle X \rangle_t) + (1-\alpha)(X_T - X_t)}}{\alpha(\alpha-1)} \right] dz \\ &= 2\bar{\sigma} \sqrt{\frac{T}{\pi}} S_t^{1-\alpha} \int_0^{\infty} \frac{e^{-z^2 \langle X \rangle_t} E_t [e^{\lambda_{z,\alpha}(\langle X \rangle_T - \langle X \rangle_t)}]}{\alpha(\alpha-1)} dz, \end{aligned} \quad (23)$$

In the second equality we **have used equation (19)**. For most stochastic volatility models **the Laplace transform of $\langle X \rangle_t$ is known**, and **decays fast enough to yield convergence of the integral**.

The target volatility option: Laplace transform method

By inverting the transform we finally have:

$$P_t(k) = \frac{4e^{ak}\bar{\sigma}\sqrt{T}}{\pi^{3/2}} \int_0^\infty \int_0^\infty e^{-z^2\langle X \rangle_t} \operatorname{Re} \left(\frac{S_t^{1-a-iu} E_t \left[e^{\lambda_{z,a+iu}(\langle X \rangle_T - \langle X \rangle_t)} \right]}{(a+iu)(a+iu-1)} \right) \cos(uk) dz du. \quad (24)$$

We have applied a particular trigonometric representation of the Laplace inversion which is use [Abate-Whitt](#) quadrature method.

The [TVO call](#) price is obtained by put-call parity with the [target volatility forward](#):

$$TVOF_0 = \bar{\sigma}\sqrt{T/\langle X \rangle_T}(S_T - K) \quad (25)$$

whose valuation is straightforward after conditioning the value process to σ_T .

The target volatility strategy

A **target volatility strategy** is a dynamic portfolio allocation in an equity S_t and a bond B_t aimed at maintaining a constant portfolio volatility $\bar{\sigma}$ throughout the whole holding period $[0, T]$.

This is done by means of trades in the underlying occurring at given dates t_1, \dots, t_n , of fixed lag δ . The volume of the trades at each period depends on the **volatility realized in the previous period**.

Let the equation for the bond and the stock be given by:

$$dS_t = \mu S_t dt + \sigma_t S_t dW_t \quad (26)$$

$$dB_t = rB_t dt \quad (27)$$

for some stochastic volatility process σ_t .

The target volatility strategy

To construct the portfolio let Π_0 our initial endowment. Write Π_t in terms of number of portfolio holdings as:

$$\Pi_t^\delta = \Theta_t^\delta S_t + \Theta_t^r B_t = w_t^r \Pi_t^\delta + w_t^\delta \Pi_t^\delta$$

where, $w_t^r = \Theta_t^r B_t / \Pi_t^\delta$, $w_t^\delta = \Theta_t^\delta S_t / \Pi_t^\delta$. Observe that $w_t^r + w_t^\delta = 1$.

Calculating the stochastic differential and assuming the self-financing property we have:

$$d\Pi_t^\delta = \Theta_t^\delta dS_t + \Theta_t^r dB_t = w_t^r \Pi_t^\delta dB_t / B_t + w_t^\delta \Pi_t^\delta dS_t / S_t = \quad (28)$$

$$r\Pi_t^\delta dt + w_t^\delta (\mu - r)\Pi_t^\delta dt + w_t^\delta \sigma_t \Pi_t^\delta dW_t \quad (29)$$

The target volatility strategy

Now, we want to set the time-varying (with δ and t) exposure w_t^δ to the stock component, in such a way that the log-returns of Π_t^δ show approximately constant volatility. Further, we want w_t^δ to **depend only on observable market data**.

This can be achieved by setting:

$$w_t^\delta = \bar{\sigma} \left(\frac{\delta}{\sigma_0^2 \delta \mathbf{1}_{\{0 \leq t < t_1\}} + \sum_{i \geq 1} I_{t_{i-1}}^{t_i} \mathbf{1}_{\{t_i \leq t < t_{i+1}\}}} \right)^{1/2} \quad (30)$$

with:

$$I_s^t = \int_s^t \sigma_u^2 du \quad (31)$$

Let $Y_t^\delta = \log \Pi_t^\delta$. We have the following proposition:

The target volatility strategy

Proposition

$Y_t^\delta \rightarrow Y_t^0$ in $L^2([0, T] \times \Omega)$ for $\delta \rightarrow 0$, where

$$Y_t^0 = (r - \bar{\sigma}^2/2)t + \int_0^t \frac{\bar{\sigma}(\mu - r)}{\sigma_u} du + \bar{\sigma}W_t \quad (32)$$

is the asymptotic portfolio of Π_t^δ .

Assume now that we want to write a derivative F on Y_t^δ . It is a consequence of the Proposition above that:

Corollary

Let F be a sufficiently regular European claim written on Y_t^δ . As $\delta \rightarrow 0$ the price of $F(Y_t^\delta)$ converges to $F^{BS}(\bar{\sigma})$.

In particular a TVS extends the property of the TVO to any moneyness.

Open problem 1 : the corollary above ensures that for fixed δ the price of a derivative contract on a TVS can be bound as:

$$\mathbb{E}[F(Y_t^\delta)] \leq F^{BS} + \epsilon(\delta, \text{parameters}) \quad (33)$$

The error ϵ , which depends on δ and on the parameters of σ_t , represents from a practical perspective the margin an operator must charge to an investor over the Black Scholes to underwrite the derivative F .

Is it possible to estimate, bound, or otherwise assess ϵ ?

The target volatility strategy: distribution and moments properties

The **expected return of the asymptotic portfolio** is easy to compute, provided we know **the first inverse moment** of σ_t . Indeed

$$\mathbb{E}[Y_t^0] = \bar{\sigma}(\mu - r) \int_0^t \mathbb{E}\left[\frac{1}{\sigma_u}\right] du.$$

However, analytical formulae for the moments of $\int_0^t du/\sigma_u$ other than the first **have, to our knowledge, not been derived**, even for tractable stochastic volatility model (Dufresne, [4] has tried, but mentions insuccess).

Open problem 2: Can be such formulae found? If not, empirical testing supports the following evidence:

- 1 If the **correlation** between S_t and σ_t is **negative** (resp. positive) then the variance of Y_t^0 is **higher** (resp. lower) than that of the underlying risk-neutral Black-Scholes asset of standard deviation $\bar{\sigma}$ and return rate r ;

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- 2 The skewness of Y_t^0 is **positive**; the higher the **volatility of the volatility** σ_t , the higher the skewness.
- 3 Numerically Y_t^0 shows **excess kurtosis**; however if $\text{Corr}(S_t, \sigma_t) > 0$ then graphically the tails of the distribution density seem to be **at best Gaussian** (which is counter-intuitive).

How to prove some of the above rigorously?

Heston model simulation, parameters from [8]

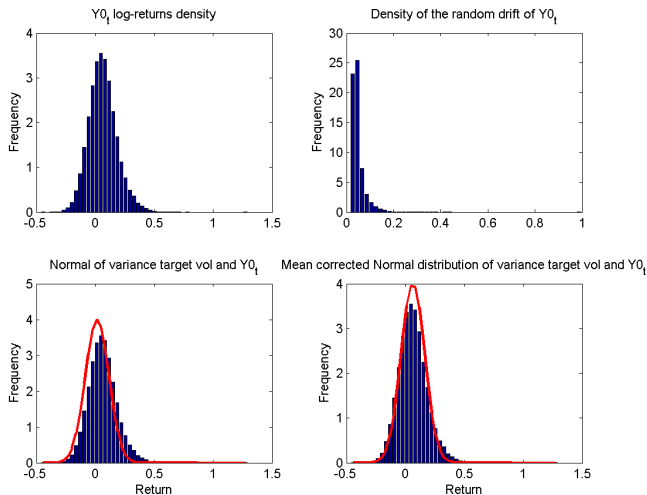


Figure : $\rho = -0.92$, vol of vol= 0.1968

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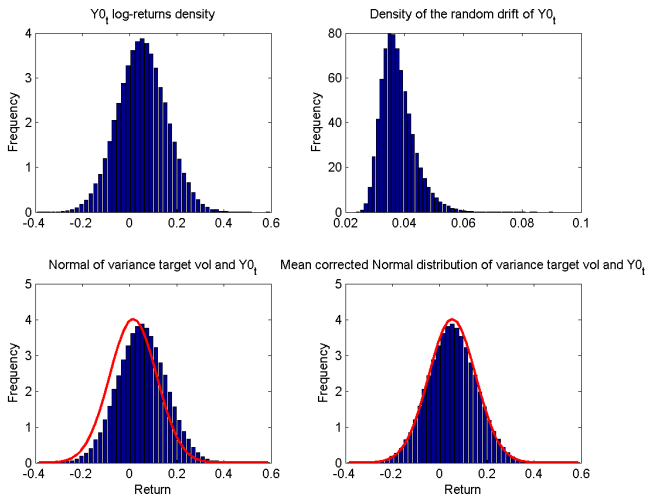


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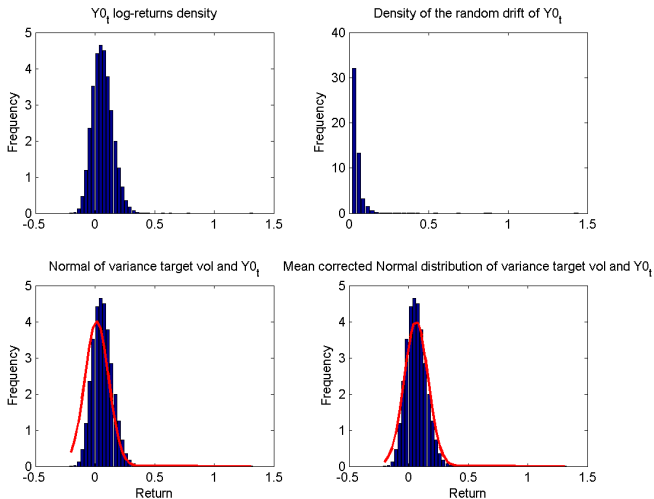


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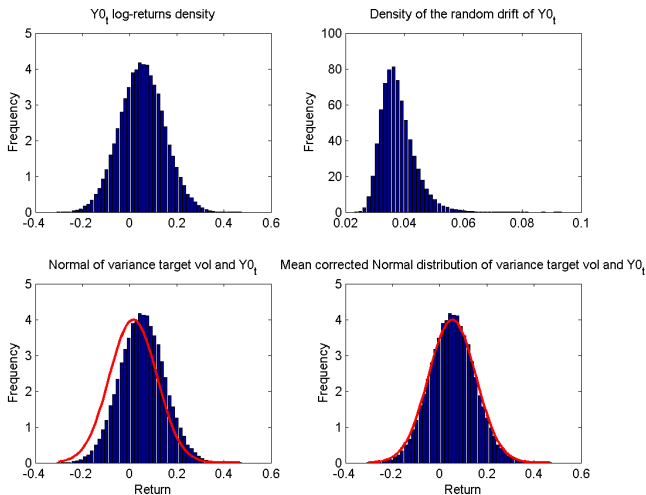


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Joint asset/volatility derivatives: the general problem

More generally to the TVO case we might want to consider **general European derivatives** that pay on a combination of S_t and $\langle X \rangle_t$.

These claims can be represented as a function $F(x, y)$ of **two variables**. Assume that the joint evolution of S_t , $v_t = \sigma_t^2$ is given by the following Ito diffusion:

$$\begin{cases} dS_t = (r - d)S_t dt + \sqrt{v_t}S_t dW_t^1 \\ dv_t = \alpha(t, v_t)dt + \beta(t, v_t)dW_t^2. \end{cases} \quad (34)$$

This can be augmented as to include $I_t = \langle X \rangle_t$ by considering the ODE:

$$dI_t = v_t dt. \quad (35)$$

The correlation between W_t^1 , W_t^2 is **arbitrary**. Hence under this framework we manage to extend the TVO pricing as to **include correlation**.

Joint asset/volatility derivatives: the general problem

The Feynman-Kac theorem tells us that under appropriate assumptions the discounted risk-neutral expectation of $F(S_T, I_T)$ under the Markovian family of probability distribution generated by (34)-(35) is the solution of some parabolic PDE having terminal condition $F(S_T, I_T)$.

More precisely, and specifically:

$$V_t = \mathbb{E}_t[e^{-r(T-t)} F(S_T, I_T)] \quad (36)$$

is the solution to the degenerate PDE

$$\frac{\partial V}{\partial t} + (r - d)S \frac{\partial V}{\partial S} + \alpha \frac{\partial V}{\partial v} + v \frac{\partial V}{\partial I} + \frac{vS^2}{2} \frac{\partial^2 V}{\partial S^2} + \frac{\beta^2}{2} \frac{\partial^2 V}{\partial v^2} + \quad (37)$$

$$\rho\beta\sqrt{v}S \frac{\partial V}{\partial S \partial v} - rV = 0, \quad (38)$$

having terminal condition $F(S_T, I_T)$.

Joint asset/volatility derivatives: the general problem

Assume that the **fundamental solution** $\gamma(z, v, t)$ of the PDE associated to the diffusion (34) alone is known and let $\Gamma(z, w)$ be instead the fundamental solution of (37).

Notably, for most volatility models we have that there exists $G : \mathbb{R} \rightarrow \mathbb{R}$ and $g : \mathbb{R}^2 \rightarrow \mathbb{R}$ such that:

$$\Gamma(z, w, v, t) = G(g(z, w), v, t) \quad (39)$$

$$\gamma(z, v, t) = G(g(z, 0), v, t) \quad (40)$$

Finally, the following **pricing equation** holds true:

Proposition

Under certain constraints on (34) the solution of (37) is given by:

$$V(S, I, v, t) = \frac{e^{-r(T-t)}}{4\pi^2} \times \int_{ik_1 - \infty}^{ik_1 + \infty} \int_{ik_2 - \infty}^{ik_2 + \infty} S^{-iz} e^{-iz(r-d)(T-t)} e^{-iwl} \hat{\Gamma}(z, w, v, t) \hat{F}(z, w) dz dw. \quad (41)$$

Valuation of the pricing integral

The numerical evaluation of integral (41) poses some difficulties, having a **two-dimensional complex** integrand. These can be both due to the **oscillation** and **convergence rate along the chosen line**.

There is a typical strategy to overcome these problems, allowed by the **Cauchy theorem**: the **saddle point method**. We deform the integration contour to γ for which there exists a point $p \in \gamma$ such that:

- 1 The imaginary part of the integrand has a stationary point in p : this reduces the **oscillation**;

Open problem 3: Any way of determining γ for, say, the TVO payoff and the Heston model?

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- 1 The imaginary part of the integrand has a stationary point in p : this reduces the **oscillation**;
- 2 The real part of the integrand has a local maximum in p ; this means that **the mass is mostly around p** and there is less computational effort to get the prescribed accuracy.

Open problem 3: Any way of determining γ for, say, the TVO payoff and the Heston model?

Joint asset/volatility derivatives: some fantasy payoffs

Following are some more payoffs of the type $F(S_T, I_T)$, which do not exist but **could make sense** as real-life investments:

- ① Double digital call:

$$F(S_T, I_T) = \mathbb{1}_{\{S_T \geq K_1, I_T/T \geq K_2\}}; \quad (42)$$

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- 3 Volatility-struck call option:

$$F(S_T, I_T) = \left(S_T - N \sqrt{\frac{I_T}{T}} \right)^+. \quad (44)$$

Thank you

All criticism, comments and suggestions welcome:

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