

## TUTORIAL

# Should you hedge with implied or realized? Volatility Arbitrage

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The material is adopted for  
Topic DH Final Project 2023

## How to use

- While we re-visit relevant first principles, the tutorial is not a substitute for the core lectures, eg Understanding Volatility, Black-Scholes. There may be no opportunity to re-explain each concept or formula. If you have not reviewed the core lecture(s) and Exercises/Solutions – the difficulty to follow the material can be expected.
- The tutorial/Python lab is not a full lecture with a set program of content. Frequent changes between slides/computation to be expected – the flow might be ‘punctuated’.
- The tutorial is delivered ‘from the desk’ and typically includes a computation (Excel, Python, R etc) – not built from the first principles. The teaching is by presenting an example – each example, case is inevitably limited in scope (eg, we will not cover the entire delta-hedging)

## Learning outcomes

- Revisit delta-hedging and gain/loss in a hedged option position
- Case 1: Volatility Arbitrage – ‘the market is wrong’ and we have a better forecast for volatility. Outcome relies on  $(Rlzd - Imp)$ .
- Case 2: Sell Side business – we **will not** revisit but, the inverse applies  $(Implied - Realized)$ .
- EXCEL walkthrough Delta-replication with Gamma Payoff

These slides will be released AFTER tutorial.

We refer to Understanding Volatility Lecture SOLUTIONS – recommend to download from CQF Portal, print and review on paper.

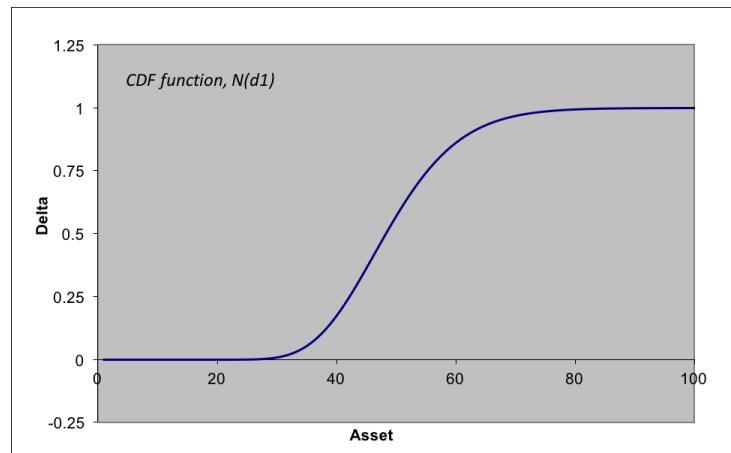
## ► Sell Call to Open

Continuous hedging means sliding up and down the CDF: **buying OR selling**

- common sense: no need to have 100% exposure to the falling price
- however, falling stock = high realized volatility (☹ hedger).

The more price drops the less shares we need to hold. At 0% or 100% hedged we are not much sensitive to change in BS Delta

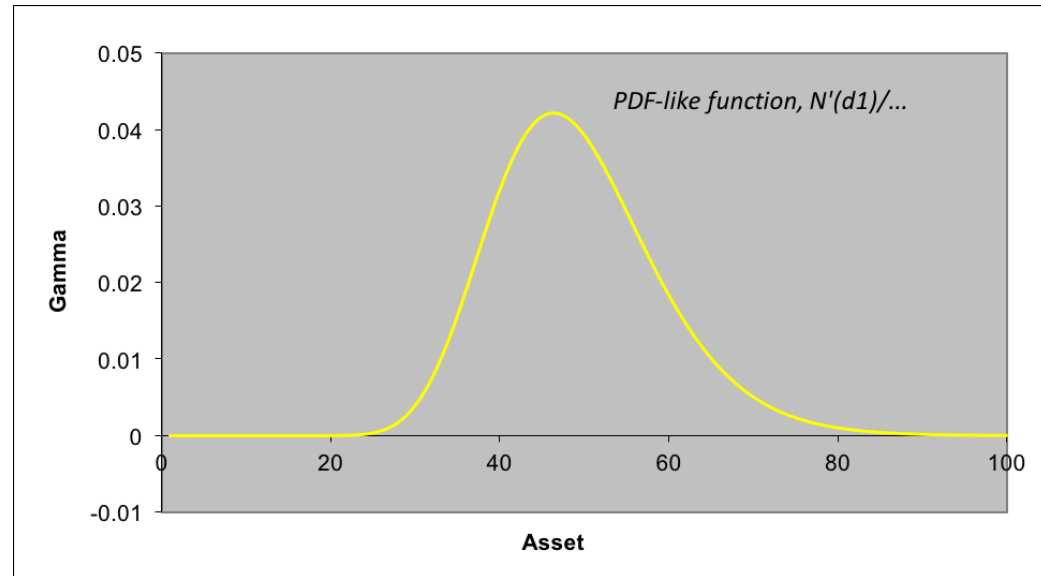
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Not selling fast enough means extra losses (right-to-left)

(left-to-right) Not buying fast enough means missed profits

## ► “Short Gamma”

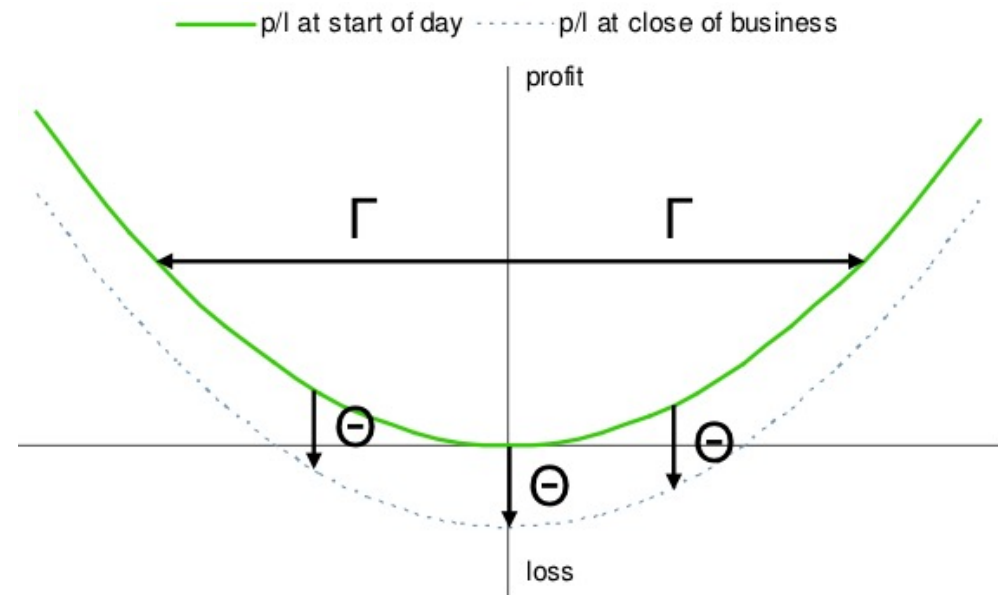
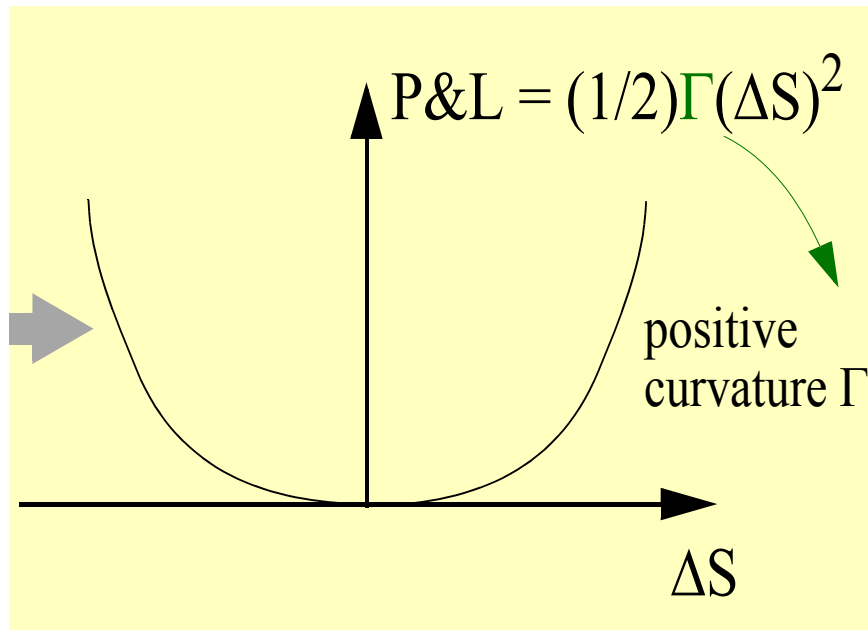


“Fast enough” equates to Gamma.

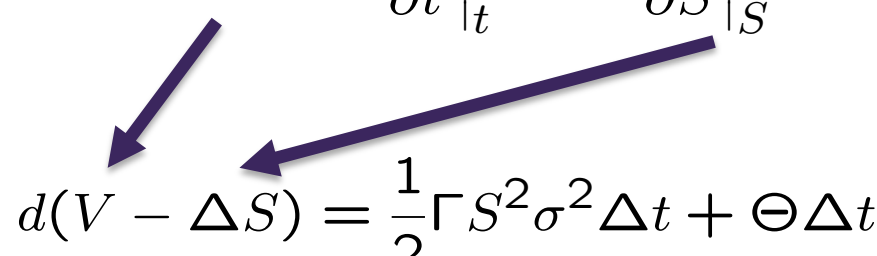
Traders professional language to say **short gamma**, as in “not enough gamma” or failure to anticipate that Gamma increases.

## ► Convex Payoff

$d(\text{P\&L})$  gains from curvature and loses from time decay.



## ► Convex Payoff – applies even if hedged

$$V(S + \Delta S, t + \Delta t) = V(S, t) + \frac{\partial V}{\partial t} \Big|_t \Delta t + \frac{\partial V}{\partial S} \Big|_S \Delta S + \frac{1}{2} \frac{\partial^2 V}{\partial S^2} \Big|_S (\Delta S)^2$$

$$d(V - \Delta S) = \frac{1}{2} \Gamma S^2 \sigma^2 \Delta t + \Theta \Delta t$$

**LHS** is naturally hedged position in the option (long option, short stock), albeit an inverted position to the sell-side market maker. Matches our Case 1 Vol arb.

**RHS** matches Black-Scholes if equated to zero,

- gain from curvature (see next slide too)  $\frac{1}{2} \Gamma (\Delta S)^2$
- time decay  $\underbrace{\Theta \Delta t}$



$$\left(\frac{\Delta S}{S}\right)^2 = r^2 \approx \sigma^2 \Delta t \quad \text{prop to variance}$$

Consider P&L from a hedged position in an option, where option price has already been decomposed into Greeks:

$$\text{P\&L}_{\Delta t, \Delta S} = \cancel{\Delta(\Delta S)} + \frac{1}{2}\Gamma(\Delta S)^2 + \underbrace{\Theta\Delta t}_{\text{Black-Sholes}} - \cancel{\Delta(\Delta S)}$$

$$\text{the Black-Sholes } \Theta_i = -\frac{1}{2}\sigma_i^2 S^2 \Gamma_i$$

$$= \frac{1}{2}\Gamma(\Delta S)^2 - \frac{1}{2}\Gamma_i S^2 \sigma_i^2 (\Delta t)$$

$$= \frac{1}{2}\Gamma S^2 \left[ \left(\frac{\Delta S}{S}\right)^2 - \sigma_i^2 \Delta t \right].$$

MtM is the **difference between Realized vs Implied!**



## ► Reminder of Case 1: Volatility Arb (see Understanding Volatility core lecture)

We buy  $V_i$ , and **replicate a short position** in the better-valued option  $V_a$ .

- Selling as the stock goes up will lose us some money (deep ITM we short 100 shares). Buying back occurs as the stock goes down – natural short covering and de-risking.  
**See Excel Column J Cashflow from Replication.**

*Higher realized volatility is good for us.*

$$\sigma_a > \sigma_i$$

- Our shorting will be **compensated by**  $(S_T - K)^+$ ,  
 $V_i$  option will deliver that at time T.

## ► Hedge with the actual volatility, $\sigma_a$

So you believe an option at  $\sigma_i = 20\%$  is mispriced... **how can you profit from this?**

**Buy an option and delta-replicate:** cash from *buying*  $V^i$  and *selling*  $\Delta^a$  quantity of the stock:

$$-V^i + \Delta^a S$$

By continually selling stock we replicate a short position in a correctly priced option  $V^a$ .

Eventually, we shall earn a pile of money equal to option premium  $\$V^a$ ... at the market's expense!

## ► P&L (MtM) mathematical result

Let's do the maths **on the mark-to-market basis**, by which we mean to consider P&L over each time step.

'Today' at time  $t$ :

Option	$V^i$
Stock	$-\Delta^a S$
Cash	$-V^i + \Delta^a S$

'Tomorrow' at time  $t + dt$ :

Option	$V^i + dV^i$
Stock	$-\Delta^a S - \Delta^a dS$
Cash	$(-V^i + \Delta^a S)(1 + r dt)$

Therefore we have made marked to market,

$$dV^i - \Delta^a dS - (V^i - \Delta^a S) r dt \quad \dagger \quad (1)$$

Because the option would be correctly valued at  $V^a$  then we have

$$dV^a - \Delta^a dS - (V^a - \Delta^a S) r dt = 0 \quad \ddagger$$

This is profit from time  $t$  to  $t + dt$  is

$$\begin{aligned} \dagger - \ddagger &= dV^i - dV^a + r(V^a - \Delta^a S) dt - r(V^i - \Delta^a S) dt \\ &= dV^i - dV^a - r(V^i - V^a) dt \\ &= e^{rt} d(e^{-rt}(V^i - V^a)) \quad \text{by Integrating Factor } e^{-rt} \end{aligned}$$

$$d(e^{-rt}V) = e^{-rt}dV - re^{-rt}Vdt = e^{-rt}(dV - rVdt)$$



PV-ing that increment of profit to  $t_0$  gives

$$e^{-r(t-t_0)} \underbrace{e^{rt} d\left(e^{-rt}(V^i - V^a)\right)} = e^{rt_0} d\left(e^{-rt}(V^i - V^a)\right)$$

And **the total profit** from  $t_0$  to expiration comes from summation (integration in continuous time)

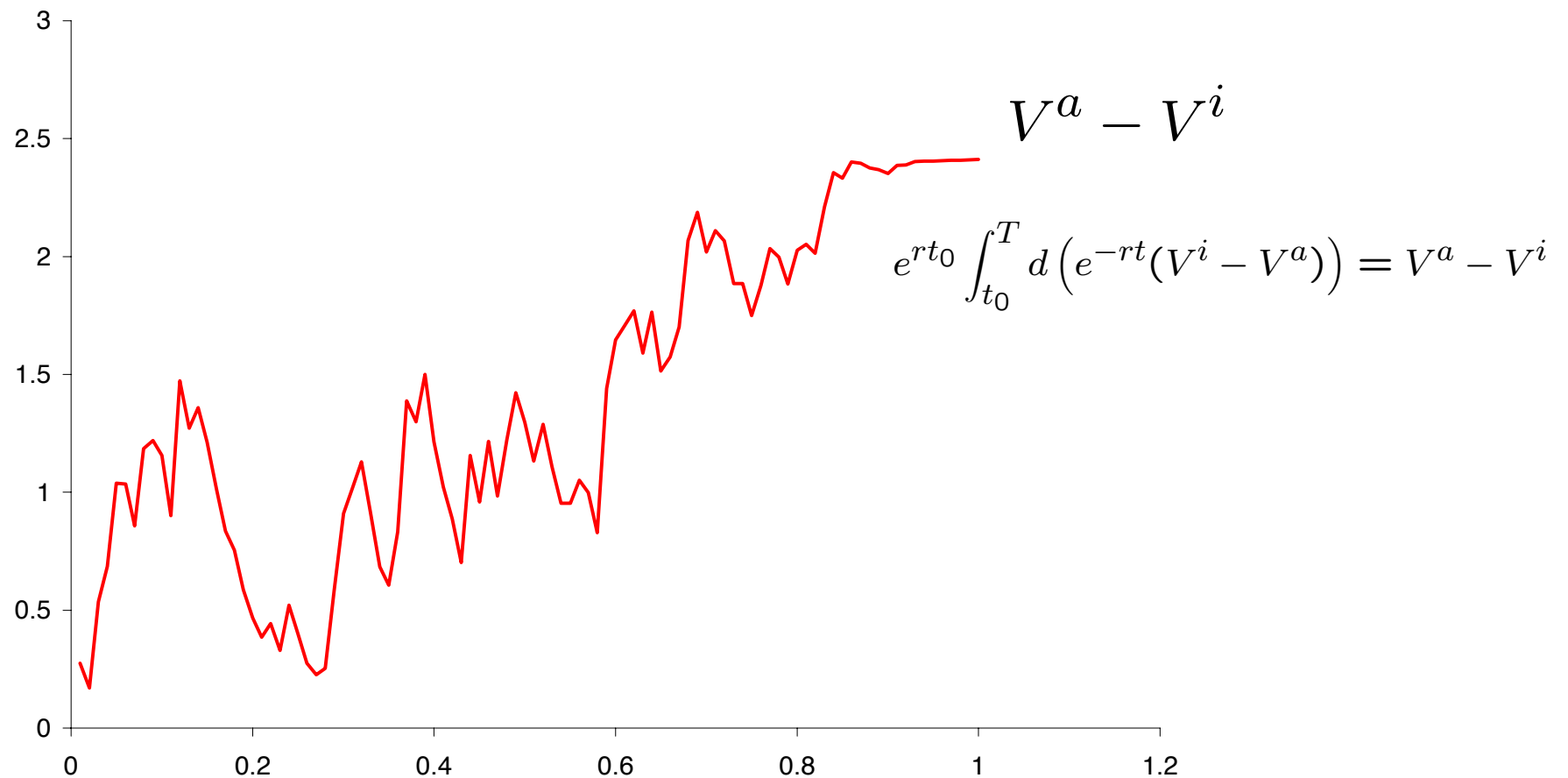
$$e^{rt_0} \int_{t_0}^T d\left(e^{-rt}(V^i - V^a)\right) = V^a - V^i$$

The total profit is a known quantity.

# Tutorial Notes 1 (integrating factor working)

## Tutorial Notes 2 (total profit working)

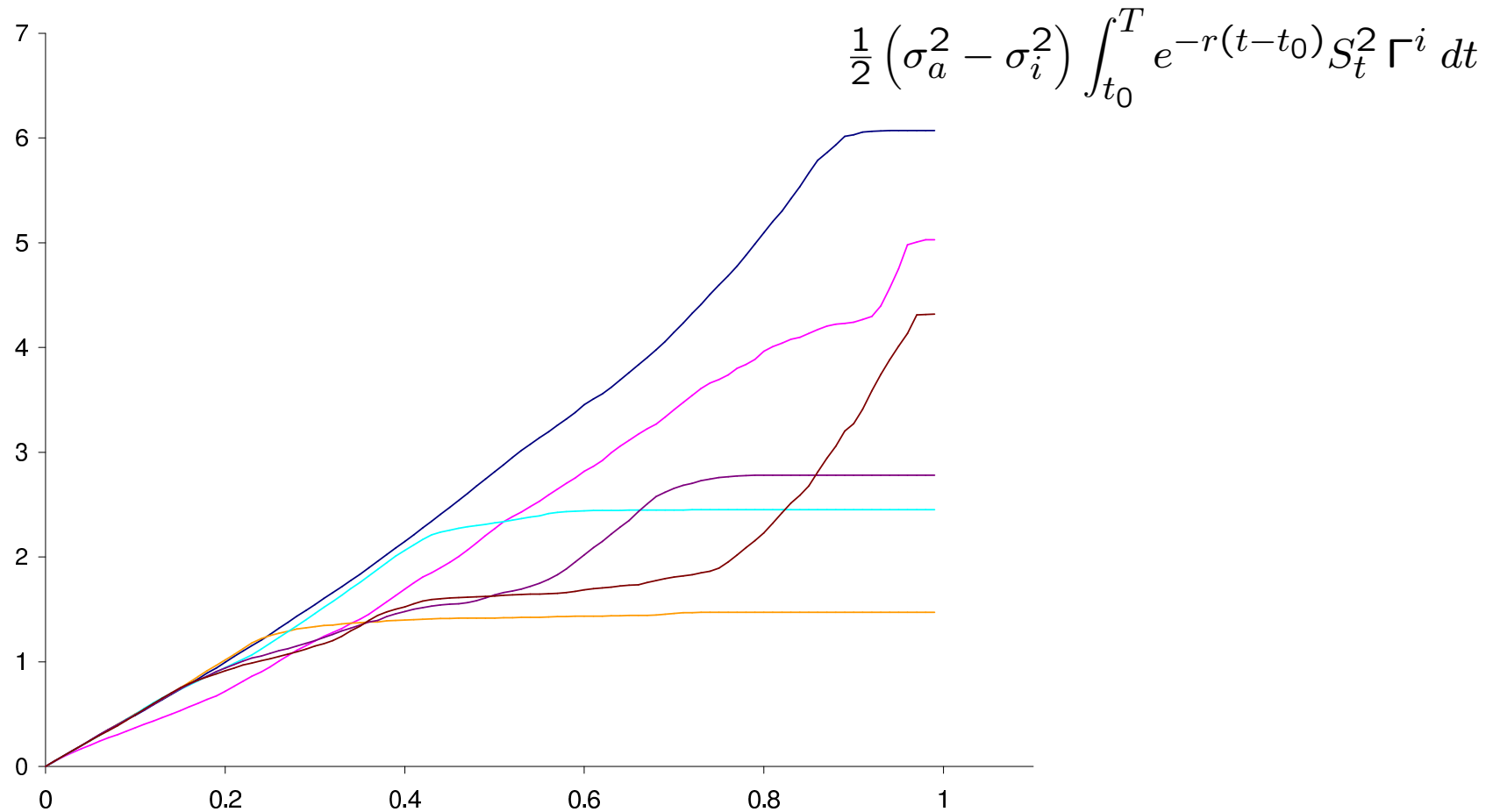
## ► P&L from hedging with the actual



How the guaranteed profit is achieved is random. MtM P&L is affected by asset price and Gamma.



## ► P&L from hedging with the implied



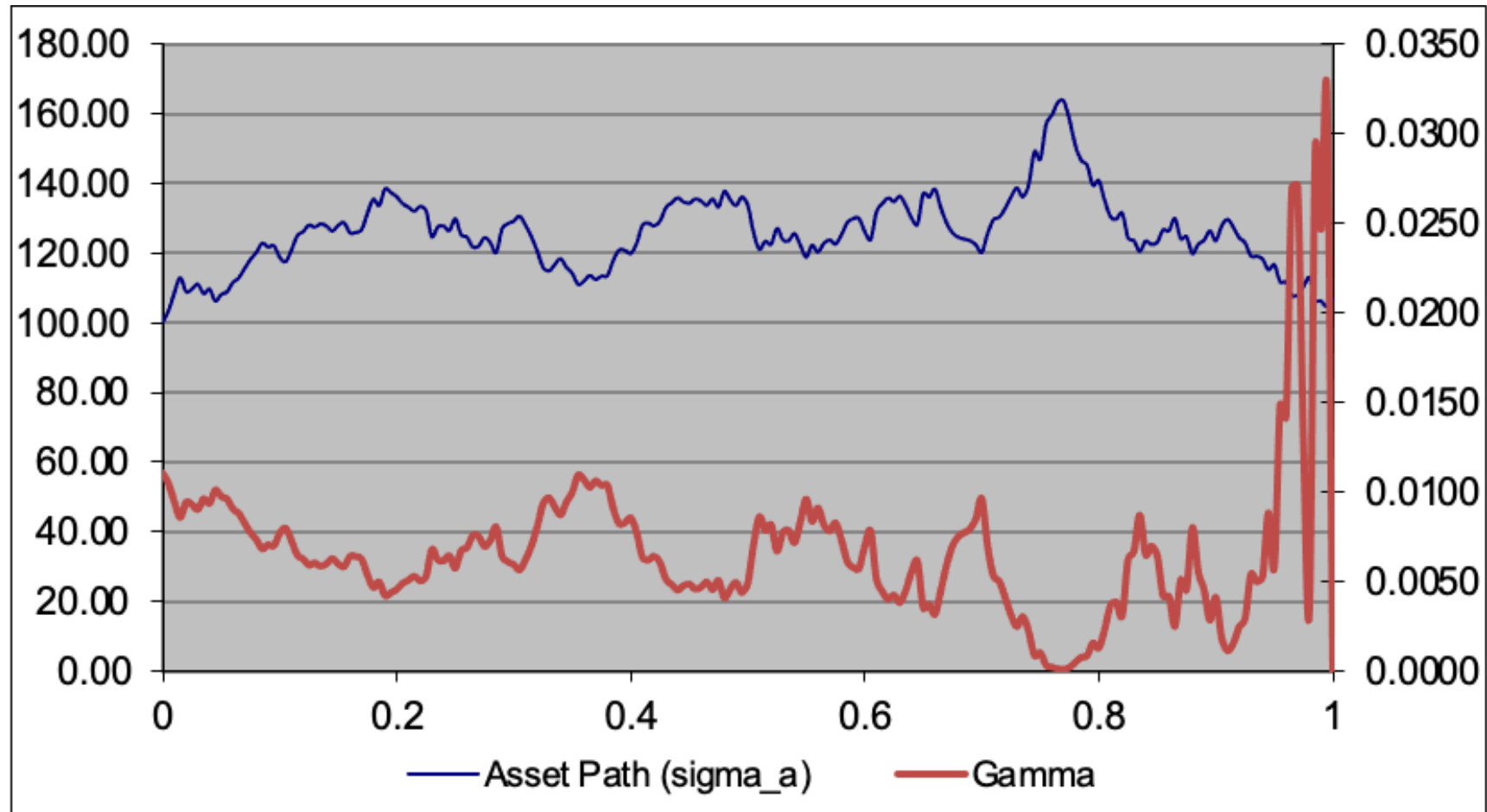
Using implied volatility  $\sigma_i$  as a prediction, while asset evolves according to its own actual volatility  $\sigma_a$ . **End result is uncertain.**



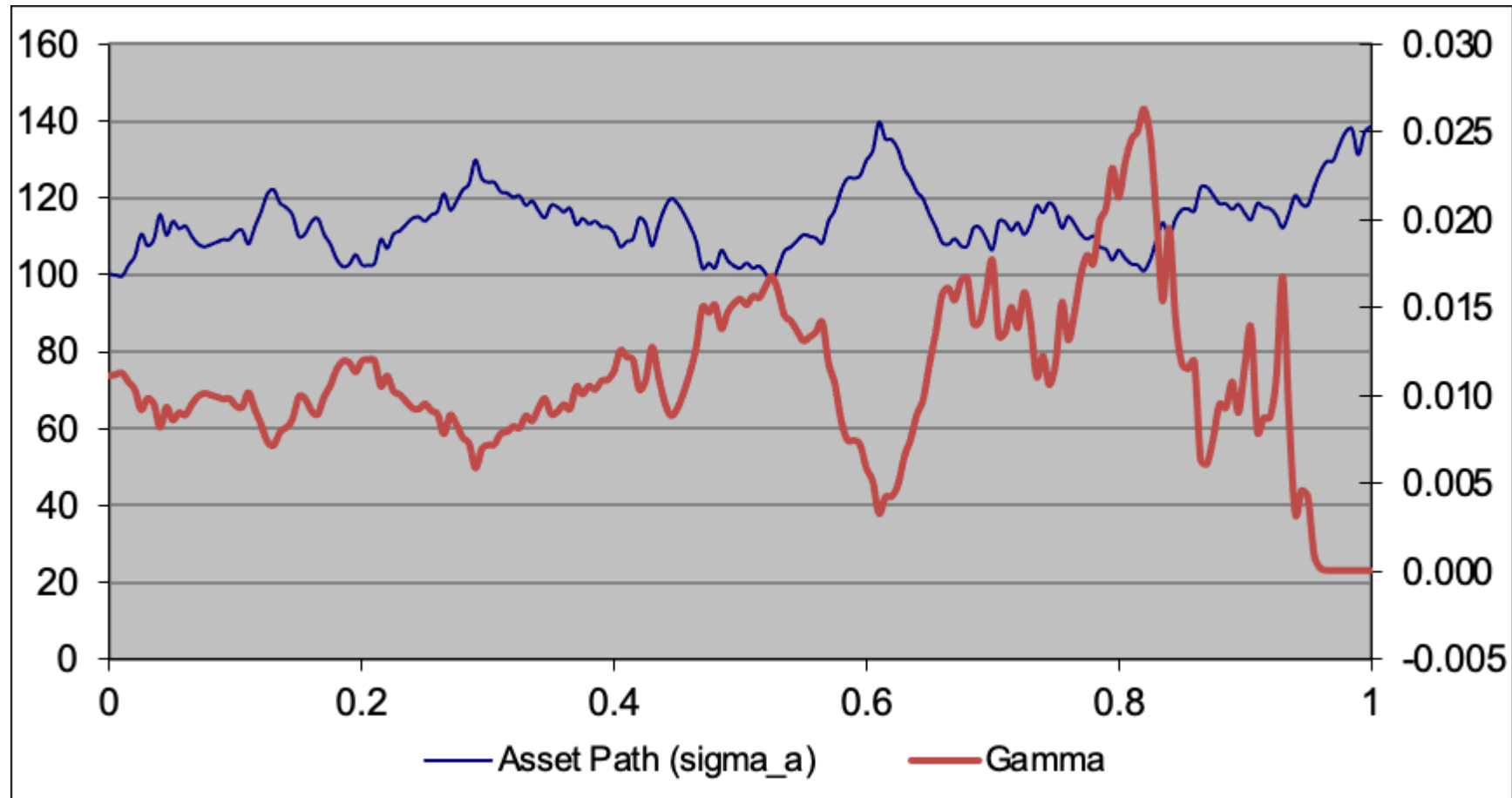
$$V^a - V^i$$

**The following slides present modelling results from Excel implementation of Case 1: Volatility Arbitrage.**

However, remember we have proven mathematically that the total arb profit is a known quantity.

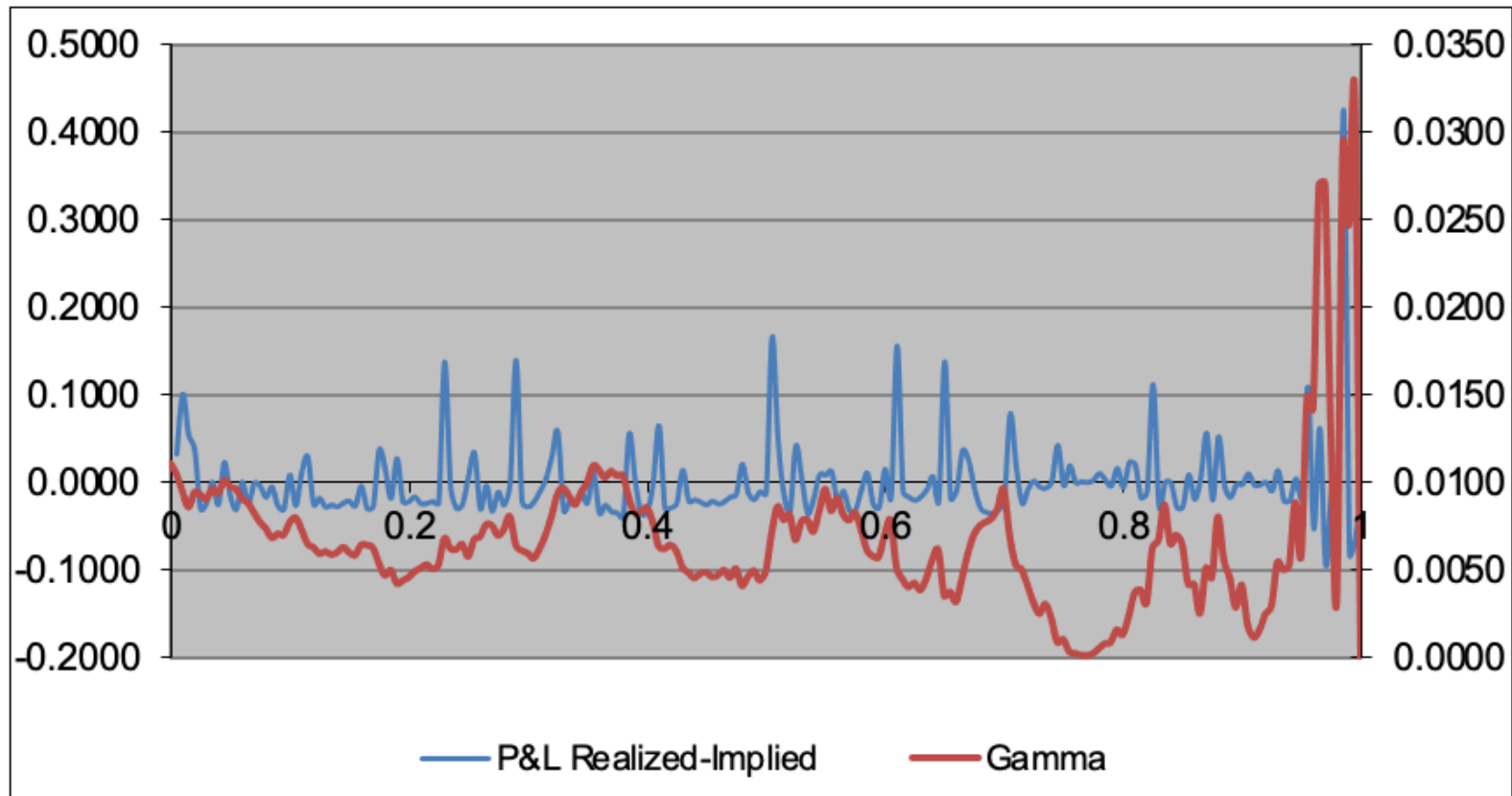


Scenario 1: asset raises, and call is deep ITM, Black-Scholes Gamma goes to near-zero.



Scenario 2: deep ITM, ATM and near-expiry situations for Black-Scholes Gamma

$$\text{Total P\&L} \approx \sum_t^T \frac{1}{2} \Gamma_t S_t^2 \left[ r_t^2 - \sigma_{t,imp}^2 \Delta t \right]$$



However, it is difficult to trace relationship over  $dt$ .

The formula suggests Vol Arb needs a high Dollar Gamma to win...  
Is that a good guess?

## ► Summary I. Should You Hedge With Implied...

**Q:** Do you hedge with implied volatility or actual volatility?

**A:** Actual, but there are strong assumptions on what we know about it, eg timescale, relationship to real variables ( $S, t$ ).

**Q:** If have a good estimate of volatility, can I enter volatility arbitrage.

**A:** Only in the situation when you have a good reason (forecast) that Realized will turn out above Implied. “Market is wrong”.

**Q:** What about the market-makers?

**A:** The party that sells an option benefits from Implied – Realized.

# Implied vs Realized



# S&P500 Index Level vs Volatility (short-term std dev)





## ► Summary II. Trading in Implied Volatility

**Q:** What have we learned about Implied vs Realized? (Bloomberg plots)

**A:** Implied volatility trends usually above Realized volatility. Options are sold at the IV price level (eg, 25% input to Black-Scholes formulae, when realized can be 18%), expensive!

**Q:** When can we enter the volatility arbitrage of Case 1 (collect from the market the premium equal to  $V_a$  dollar value).

**A:** For the arbitrage opportunity to exist we need Realized volatility to turn out (in future, and over the time) above the Implied, at least 2-3%.  
That is not the frequent scenario, we learned.

## ► Summary III. Volatility Arb

“It sure is the hell of a lot easier to just be first.” to quote from *Margin Call* movie.

**Q:** Are there other patterns about Implied Volatility?

**A:** Peaks in implied vol are followed by the periods of increased realized volatility – possible to run delta-replication (volatility arb) but one has to be quick to enter.

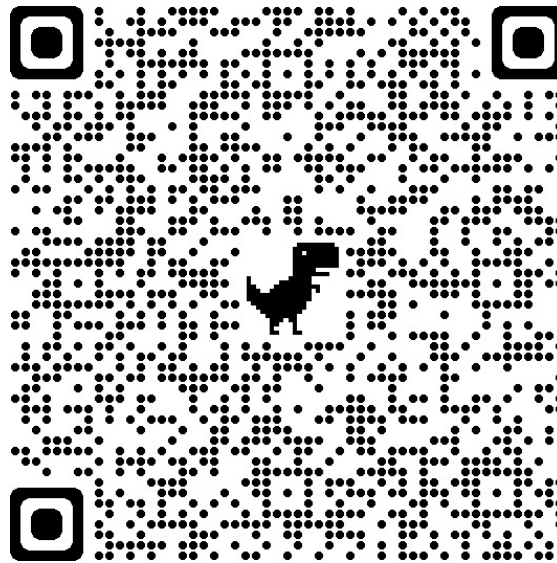
What is considered a peak depends on historical calibration:

- VIX at 35 happens once per few years (can occur twice in sequence).
- VIX at 85 is GFC 2008 or Pandemic 2020 event (supposed to be one-in-hundred years event but actually occurs far more often, even more often than 20 years).

## ► Update September 2022

S&P 500 daily return (high frequency if considering 30 years) – top.

VIX (30-day **forward volatility**) – bottom.



Source: Broadgate Advisers (Bernard Renaud), Bloomberg data.