



# PRICING AUTOCALLABLES UNDER LOCAL-STOCHASTIC VOLATILITY

Walter Farkas, Francesco Ferrari and Urban  
Ulrych

**Studied and replicated by** Jamal Verdiyev



# Motivation

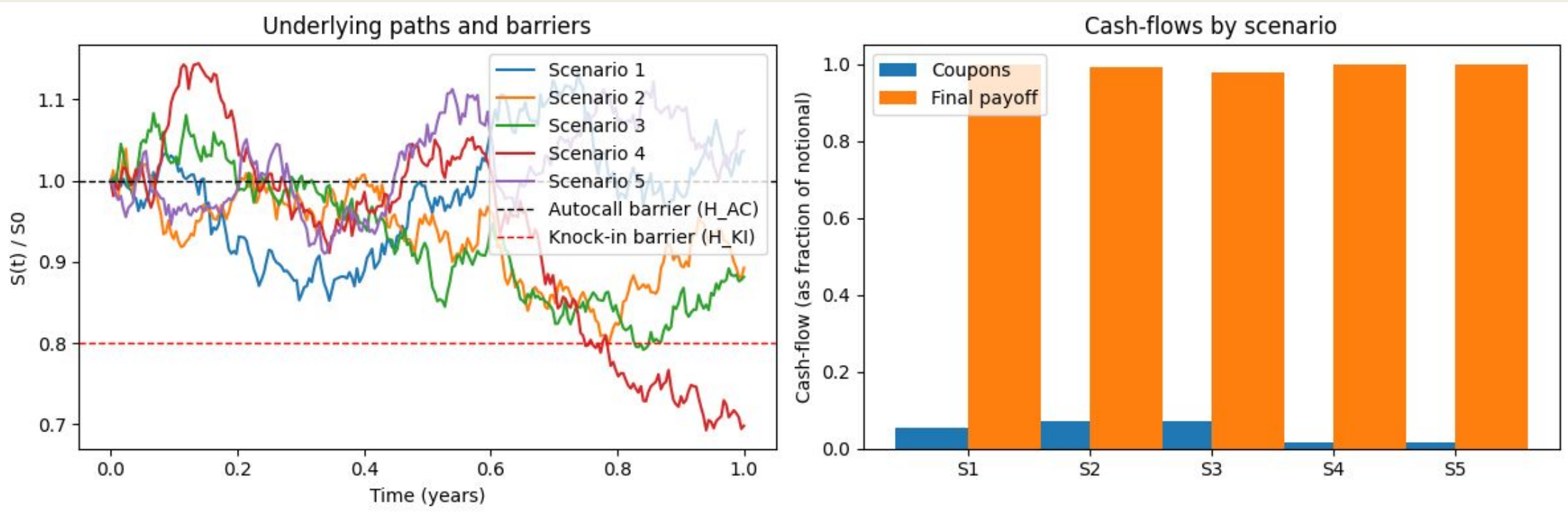
- Autocallable notes = large share of equity structured products
  - Strong path-dependence: barriers + coupons
  - Market practice: pricing mostly under **Local Volatility (LV)**
  - Question: *How different are prices under LV vs Local–Stochastic Volatility (LSV)?*
  - Impact on **model risk**, coupon levels and risk management
-

# What is an autocallable (ABRC)?

- Notional  $N$ , maturity  $T^E$ , observation dates  $T_i$
- Autocall barrier  $H^{AC}$ : **early redemption  $N$  + coupon**
- Knock-in barrier  $H$ : **activation of short put**

*Final payoff:*

- no knock-in  $\rightarrow N + \text{coupons}$
- knock-in &  $S_T < K \rightarrow$   
**loss proportional to  $(K - S_T)$**



# Numerical example: ABRC

**Notional:** \$1,000

**Underlying:** Stock XYZ, initial price = \$100

**Maturity:** 12 months

**Observation dates:**  $T_1=3m$ ,  $T_2=6m$ ,  $T_3=9m$ ,  $T_4=12m$

**Autocall barrier HAC:** 100%  $\rightarrow$  \$100

**Knock-in barrier H:** 70%  $\rightarrow$  \$70

**Coupon:** 10% annual  $\rightarrow$  paid only if autocall occurs

**Final payoff:**

-- If no knock-in  $\rightarrow$  \$1,000 + coupon

-- If knock-in  $\rightarrow$  receive shares (10 shares) + no coupon

## Scenario 1: Autocall at $T_2$ (6 months)

Price at  $T_1$  (3m): \$95 < \$100  $\rightarrow$  no autocall

Price at  $T_2$  (6m): \$105  $\geq$  \$100  $\rightarrow$  autocall triggered!

**You get:**

- \$1,000 (notional)
- \$50 (half-year coupon)

$\rightarrow$  **Total:** \$1,050

$\rightarrow$  Exit early — no risk of knock-in

## Scenario 2: Knock-in at $T_3$ , no autocall

Price at  $T_1$  (3m): \$90  $\rightarrow$  no autocall

Price at  $T_2$  (6m): \$85  $\rightarrow$  no autocall

Price at  $T_3$  (9m): \$68  $\leq$  \$70  $\rightarrow$  knock-in activated!

Price at  $T_4$  (12m): \$90 still < \$100  $\rightarrow$  no autocall

**You get:**

- 10 shares of XYZ  $\rightarrow 10 \times \$90 = \$900$
- No coupon (since no autocall)

$\rightarrow$  **Total:** \$900  $\rightarrow$  Loss of \$100

# Local Volatility

## ■ Dynamics:

$$dS_t = (r - q)S_t dt + \sigma_{LV}(t, S_t)S_t dW_t$$

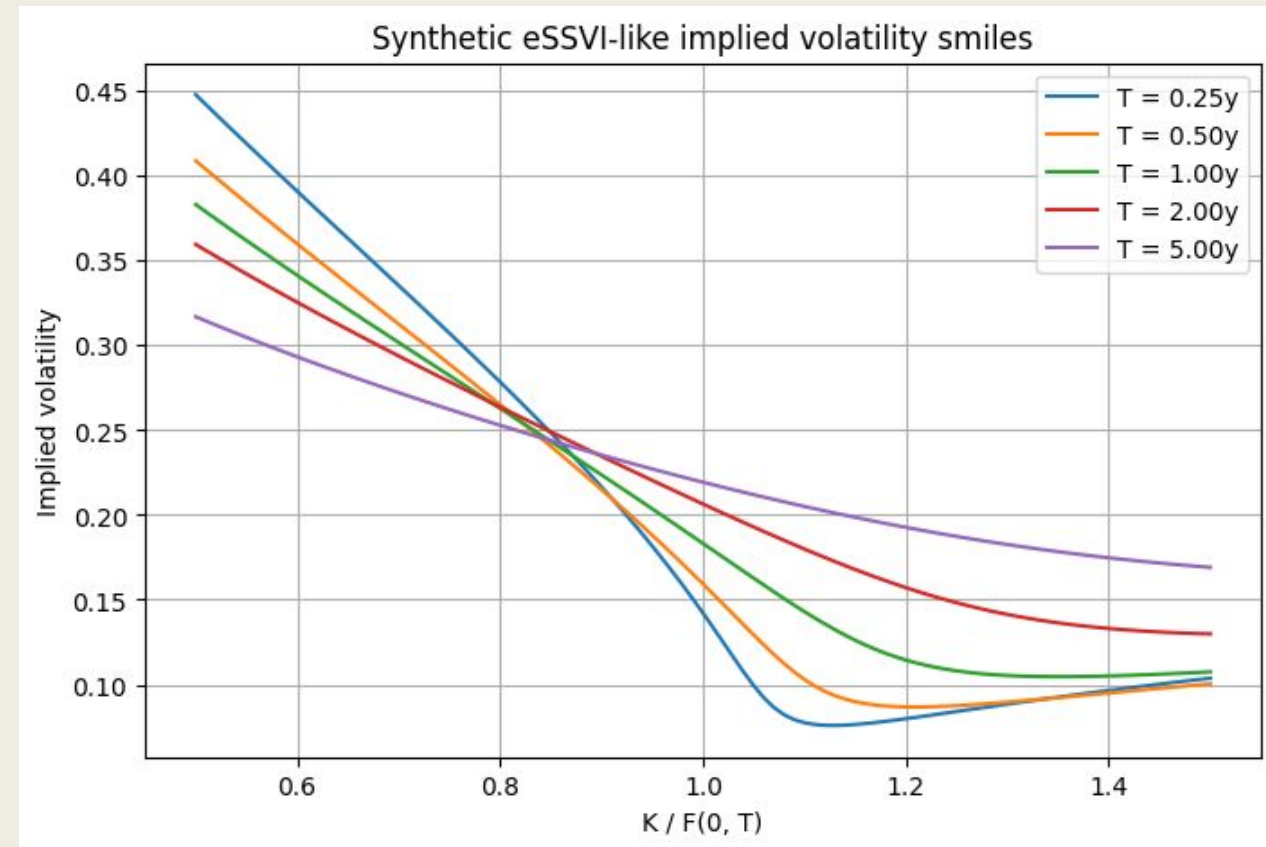
Calibrated from market IV surface (Dupire)

## ■ Pros:

- *Exact fit to European option prices*
- *PDE/tree friendly, static replication*

## ■ Cons:

- *Deterministic vol: no vol-of-vol*
- *Unrealistic smile dynamics / forward smiles*



# Heston-Stochastic volatility

■ Dynamics:

$$dS_t = (r - q)S_t dt + \sqrt{V_t}S_t dW_t^S$$

$$dV_t = \kappa(\theta - V_t) dt + \eta\sqrt{V_t} dW_t^V$$

$$\text{corr}(dW^S, dW^V) = \rho$$

- Parameters:  $\kappa, \theta, \eta, \rho, V_0$
- Pros: random volatility, leverage effect, smile dynamics
- Cons: difficult exact calibration to full IV surface

# Local-Stochastic volatility

- Hybrid model:

$$dS_t = (r - q)S_t dt + L(t, S_t)\sqrt{V_t}S_t dW_t^S$$

- $V_t$  – Heston – type variance
- $L(t, S_t)$  – leverage function correcting LV
- Goal:
  - Match European prices (as LV)
  - Keep realistic smile dynamics (as SV)
- Two-step calibration:
  1. IV surface  $\rightarrow$  LV(Dupire / eSSVI)
  2. Heston +  $L(t, S_t)$  from conditional expectations

# Gyöngy theorem & leverage function

■ Gyöngy (1986): LV can reproduce one-dimensional marginals of SV model

- In LSV:

$$L(t, S_t)^2 = \frac{\sigma_{LV}(t, S)^2}{E^Q[V_t | S_t = S]}$$

- where by Dupire's formula:

$$\sigma_{LV}^2(t, S) = 2 \frac{\frac{\partial C}{\partial T} + (r(T) - q(T))K \frac{\partial C}{\partial K} + q(T)C}{K \frac{2\partial^2 C}{\partial K^2}} \bigg|_{T=t, K=S}$$

- Implies:
  - LSV and LV have same  $S_T$  distributions
  - → same prices for all Europeans



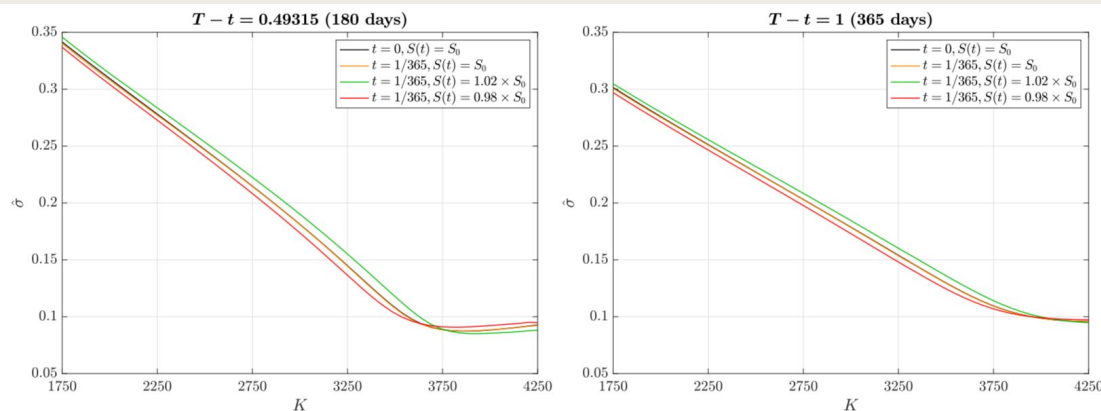


FIGURE 3.  $T - t = 180$  and 365 days IV smile dynamics in the Heston LSV model calibrated to SPX options as of January 23, 2020. In black the current IV smile. In orange, green, and red the forward IV smiles resulting from different levels at time  $t = 1/365$ .

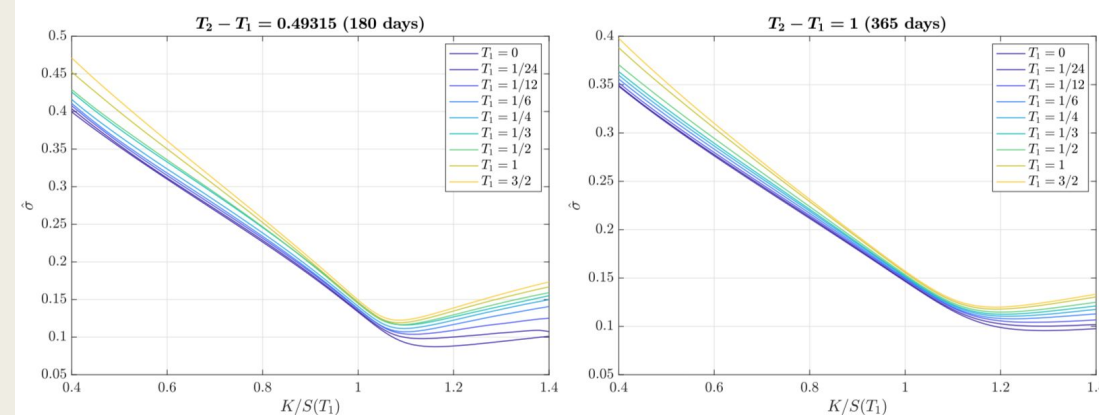


FIGURE 4. 180 and 365 days spot- and forward-starting implied volatility smiles generated by the Heston local-stochastic volatility model calibrated to SPX options as of January 23, 2020.  $T_1$  denotes the forward start date and  $T_2 - T_1$  the residual maturity.

# Empirical LV vs LSV

- Data: SPX options (IvyDB), eSSVI IV surface
- LV vs Heston LSV, calibrated to same IV surface
- LV misprices:
  - term structure of **forward-start smiles**
  - ATMF skew dynamics
- LSV reproduces both current and forward IV smiles better

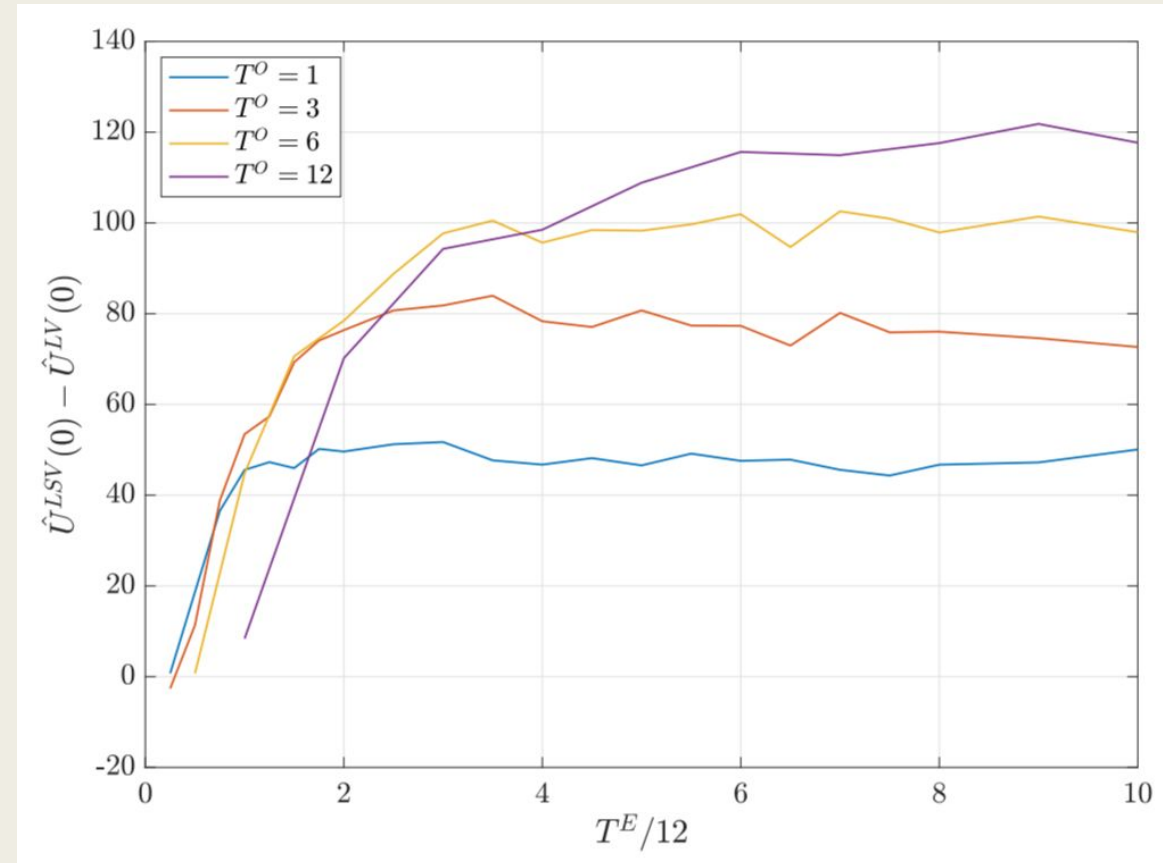
# Pricing results (LV vs LSV)

■ Product: single-asset autocallable BRC on SPX

■ Compare prices  $U^{LSV}(0)$  vs  $U^{LV}(0)$

■ Main findings:

- $U^{LSV} > U^{LV}$  almost always
- Differences up to 200-250 bps of notional
- Larger gaps for:
  - Long maturities  $T^E$
  - Space observations  $T^O$
  - High coupons & coupons barriers
  - Strong vol-of-vol  $\eta$ , negative  $\rho$



# My replication: setup

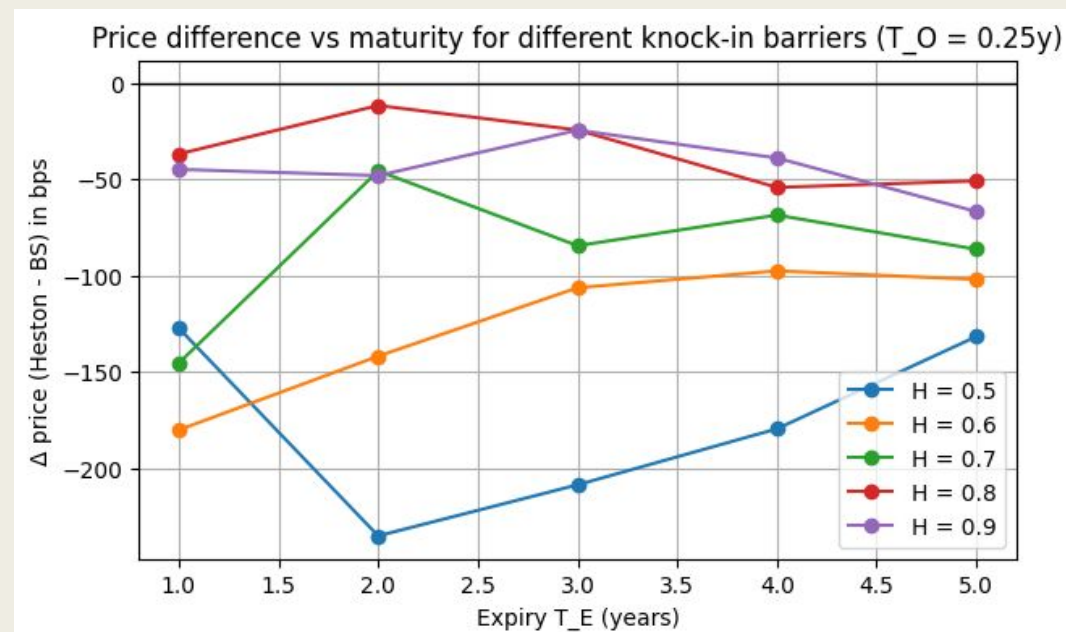
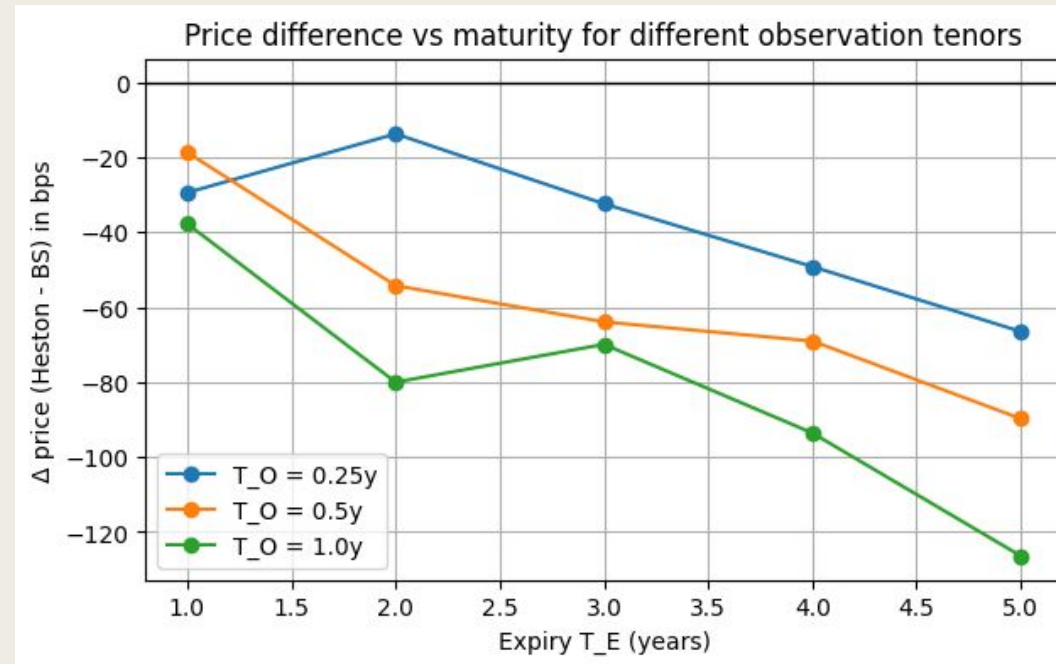
- LV proxy: Black–Scholes with constant vol  $\sigma = 20\%$
- LSV-lite proxy: Heston with  $(\kappa; \theta; \eta; \rho; V_0) = (2.0; 0.04; 0.6; -0.7; 0.04)$
- Synthetic eSSVI-like IV surface
- Benchmark ABRC:
  - $T^E = 1 - 5y; T^O = 0.25 - 1y$
  - $K = 90\%; H = 80\%; H^{AC} = 100\%$
  - *Coupons*  $Y = 0 - 12\%$ , *coupon barrier*  $H^Y$

# Replication: structure sensitivity I

Price difference:

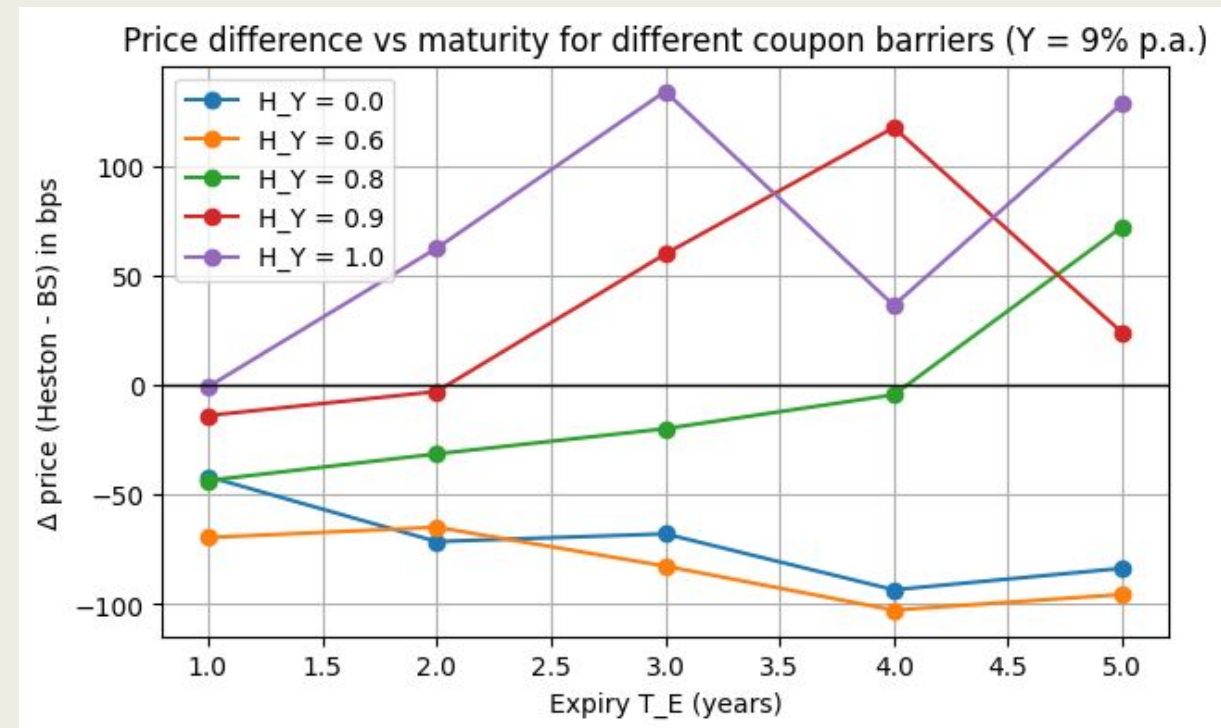
$$\Delta = U^{Heston} - U^{BS}$$

- Maturity & observation tenor:
  - $|\Delta|$  increases with maturity  $T^E$
  - $|\Delta|$  larger for rarer observations (0.5 – 1y vs 0.25y)
- Knock-in barrier  $H$ :
  - deep barriers (50–60%)  $\rightarrow$  large  $|\Delta|$  (up to ~200 bps)
  - higher barriers (80–90%)  $\rightarrow$  smaller  $|\Delta|$



# Replication: structure sensitivity II

- Coupon level  $Y$ :
  - $Y = 0\%$ :  $\Delta > 0$  (Heston price higher)
  - Higher coupons (6-12%)  $\rightarrow \Delta < 0$ ,  $|\Delta|$  up to ~150-200 bps
- Coupon barrier  $H^Y$ :
  - $H^Y = 0$ : moderate  $|\Delta|$  (–40 ... –90 bps)
  - High  $H^Y$  (90 – 100%)  $\rightarrow$  sign flip,  $\Delta > 0$ , up to ~100+ bps
- Interpretation: coupons and coupon barriers strongly amplify model risk



# Limitations of my replication

- BS vs Heston instead of full LV vs Heston-LSV
- No joint calibration to real IV surface (synthetic eSSVI only)
- No real market data (IvyDB SPX)
- Simplified product:
  - *no autocall coupon*
  - *simplified memory / single underlying*
- **Result:** sign of  $\Delta$  may differ from article, focus on **qualitative** patterns

# Takeaways & Conclusion

- Autocallables are highly model-sensitive (barriers + coupons + path dependence)
- LV calibrated to vanillas may significantly misprice ABRCs
- LSV-type models (or at least SV) better capture **vol-of-vol** and **forward smile risk**
- Structural features that drive model risk:
  - *maturity & observation frequency*
  - *knock-in & coupon barriers*
  - *coupon level*
- My replication confirms strong dependence of prices on model choice and structure, even in a simplified BS vs Heston setting

Fin.