

Secrets of the Implied Volatility Surface

Inferring Rates, Dividends, Events, and Risk-Neutral Densities from Options Prices

Bloomberg Quant Seminar, NY, Feb. 24, 2025

Timothy Klassen, PhD

CEO/Co-Founder, Vola Dynamics LLC

timothy.klassen@VolaDynamics.com

Implied Vols and Surfaces

- **Implied vol** = “the wrong number to plug into the wrong formula to get the right price” !!? YES and NO...
- **Implied volatility surfaces** (& implied borrow/forward curves) are the standard approach to summarizing the vanilla options market in an intuitive and compact manner.
- They provide the fundamental building block for the trading of vanillas (listed and OTC), as well as flow derivatives and exotics.
- There are many quant problems facing options and derivatives trading desks, and the problem of **constructing sensible, arbitrage-free volatility surfaces from options market prices** (bids/asks) is one of the hardest, esp. in real time.
- This issue already exist for European-style options (SPX, SX5E, DAX, etc).
- But the topic gets a lot more interesting & complicated for American options.

Implied Vols and Surfaces

- For European options (without divs) only integrated rates and variances matter.
 - Cash dividend modeling is relatively minor issue for Euro options (unless stochastic divs...).
- But **American** options are really path-dependent exotics and a lot of extra complications arise (esp. for ETFs, stocks, esp. with dividends):
 - Need to choose proper cash dividend and borrow cost modeling. Then:
 - Even in BS: Besides rate term-structure, proper choice of “vol time” (aka “trading time”), including “events” affects early exercise premia (EEP), and all details matter, incl. “settlement”.
 - Beyond BS: Local vol? Stochastic LV? Hacks?
- There are subtleties in “de-Americanization”, but if in doubt think of “implied vol surfaces” as summarizing European options prices in a convenient and intuitive manner (whether they are listed/traded or not).

Other Inputs for Pricing: Forwards, Rates, Divs

- To price European options of any expiry and payoff we need:
 - A discount rate curve: Term rates $r(T)$
 - A forward curve: $F(T)$ (also divs in some models of pricing Euros...)
 - An implied vol surface (IVS aka VS).
- Convenient to think of the **forward curve** in terms of **rates** and **divs** (0 if Fut, FX)
 - In the **American** case, the **rates are primary**, i.e. needed for proper EEP calculation.
 - The forward grows with the “drift” between divs, and jumps down by the div amount at ex-div dates. “drift” = fundingRate – borrowRate = $b - q$:

$$F_T = f_p(T) \left(S_0 - \sum_{i:t_i \leq T} \frac{d_i}{f_p(t_i)} \right) \quad f_p(t) := \exp \left(\int_0^t (b(t') - q(t')) dt' \right)$$

NB: Sometimes $b=r$ is used, since the difference can be absorbed into the (implied) borrow rate q .

A bit more about the (Implied) Borrow Cost

- What is the “borrow fee” that an agent bank/broker might charge a prime broker/hedge fund if the latter wants to borrow a stock or ETF (e.g. for shorting)?
- “Stock loan” aka “securities lending” mechanics is complicated...
- Mostly have to know that it acts like a div yield: If you own the stock you (can) get paid.
- Naively... the real world is much more messy: The “implied borrow cost”, which is a function of expiry, $q(T)$, can be very different from the (overnight or term) borrow fee.
- The (implied) borrow cost is something of a “fudge factor” used by market participants to balance supply & demand, to absorb modeling errors, etc.
- It has a bid/ask. You might want to use your own borrow in pricing (depending on your position, PB rates, etc).
- But, to understand market consensus, $q(T)$ has to be **implied** (in quasi real time).

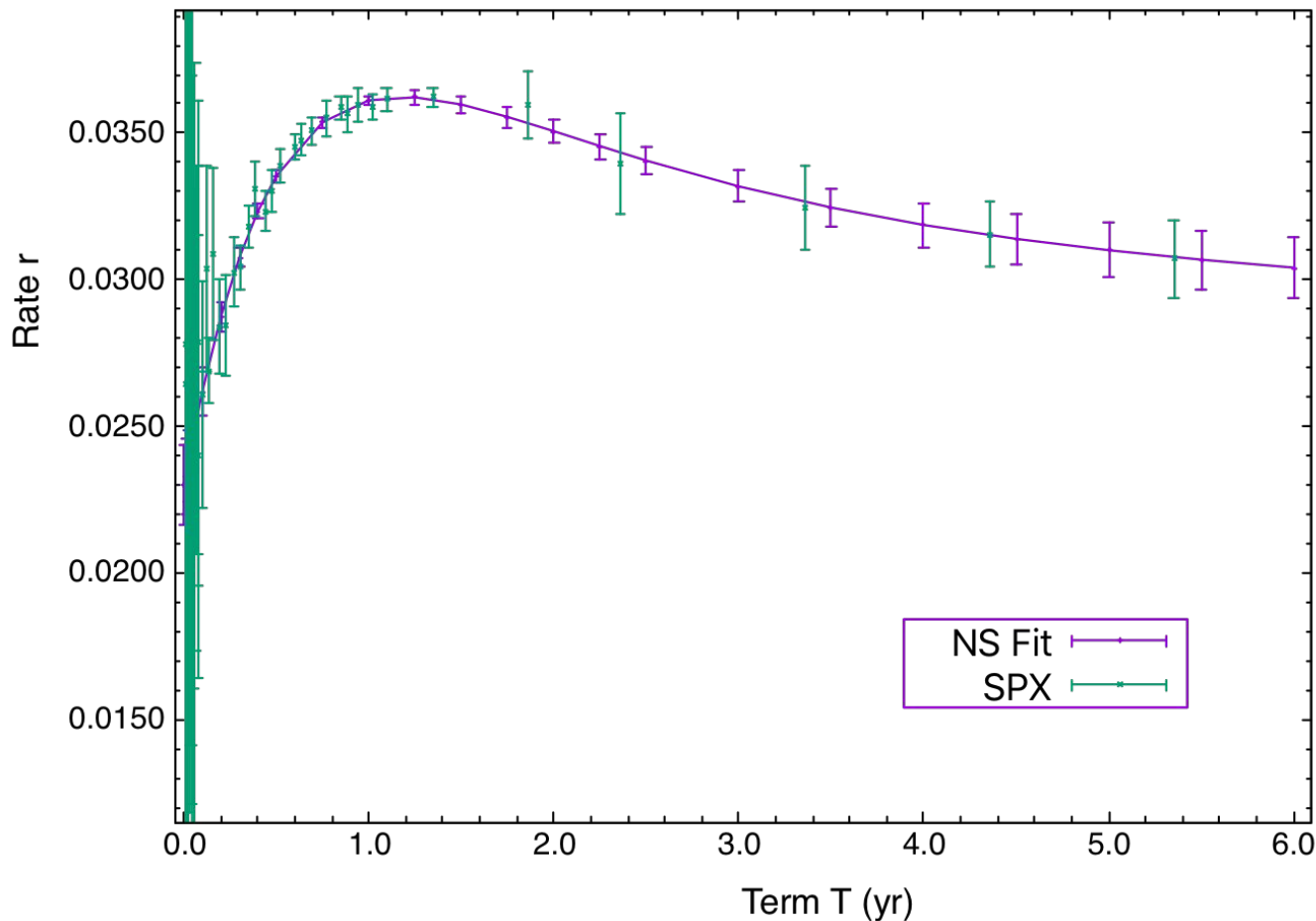
“SPIBOR” — SPX Implied Discount Rates

- What discount curve should one use for options pricing and trading?
 - Depends... but for implying borrows, vols, etc, use market consensus.
- European put-call-parity (PCP) for a given term:
 - $$C - P = DF \cdot F - DF \cdot K$$
- To imply the discount factor for a given term T, $DF = DF(T)$, we need a robust linear regression across many strikes K.
- For further robustness, can smooth rates across T via a term-structure fit.

SPIBOR — Even the Fed cares now!

- Fed (-associated) economists have written a number of papers about SPIBOR in the last few years.
- Why does the Fed care?
 - The Fed needs to know what's going on...
 - **Treasury, SOFR, etc rates are NOT risk-free rates!**
 - They can be lower than risk-free ("convenience yield"), or higher ("default risk").
 - Usually they are a bit lower, by 20 – 40 bps (almost flat).
 - SPX options market makers should be using close to risk-free rates ("box rates") due to margin requirements at exchange and OCC level.

Options-Implied Discount Rates 20220811-130000, chi2Red=0.170

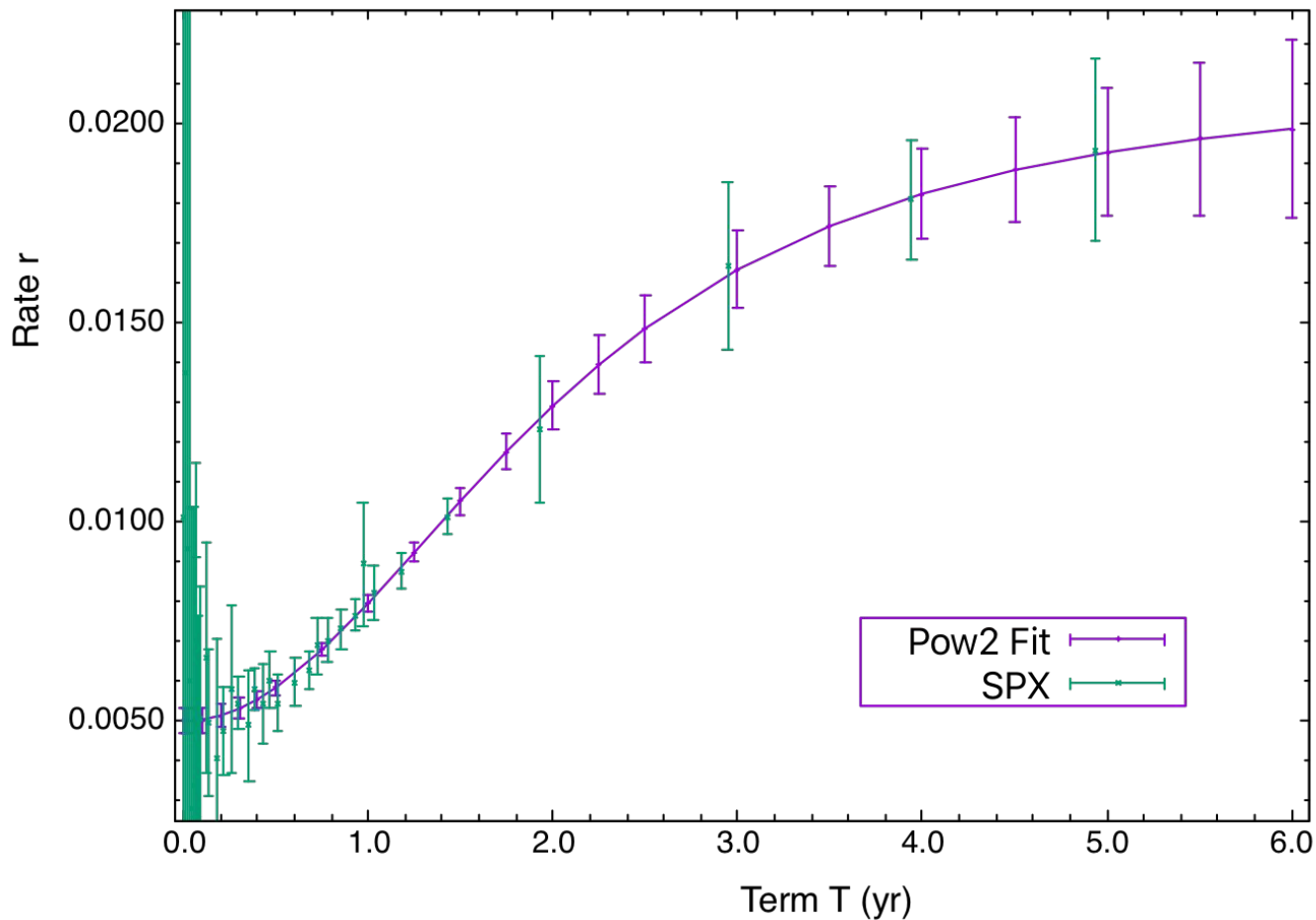


What discount rates
should I use?

SPIBOR

Just one snapshot!

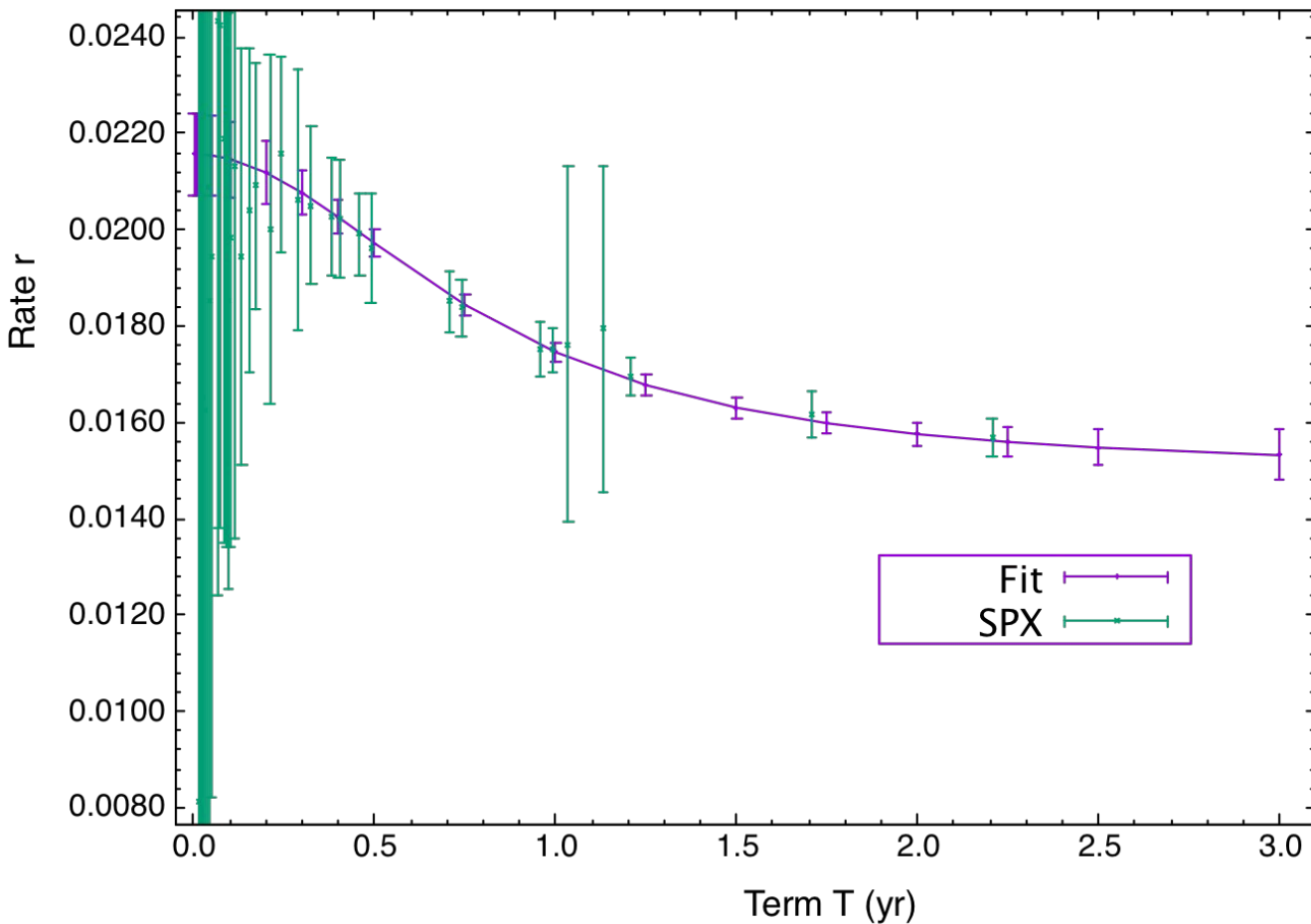
Nelson-Siegel TS fit



What discount rates
should I use?

SPIBOR

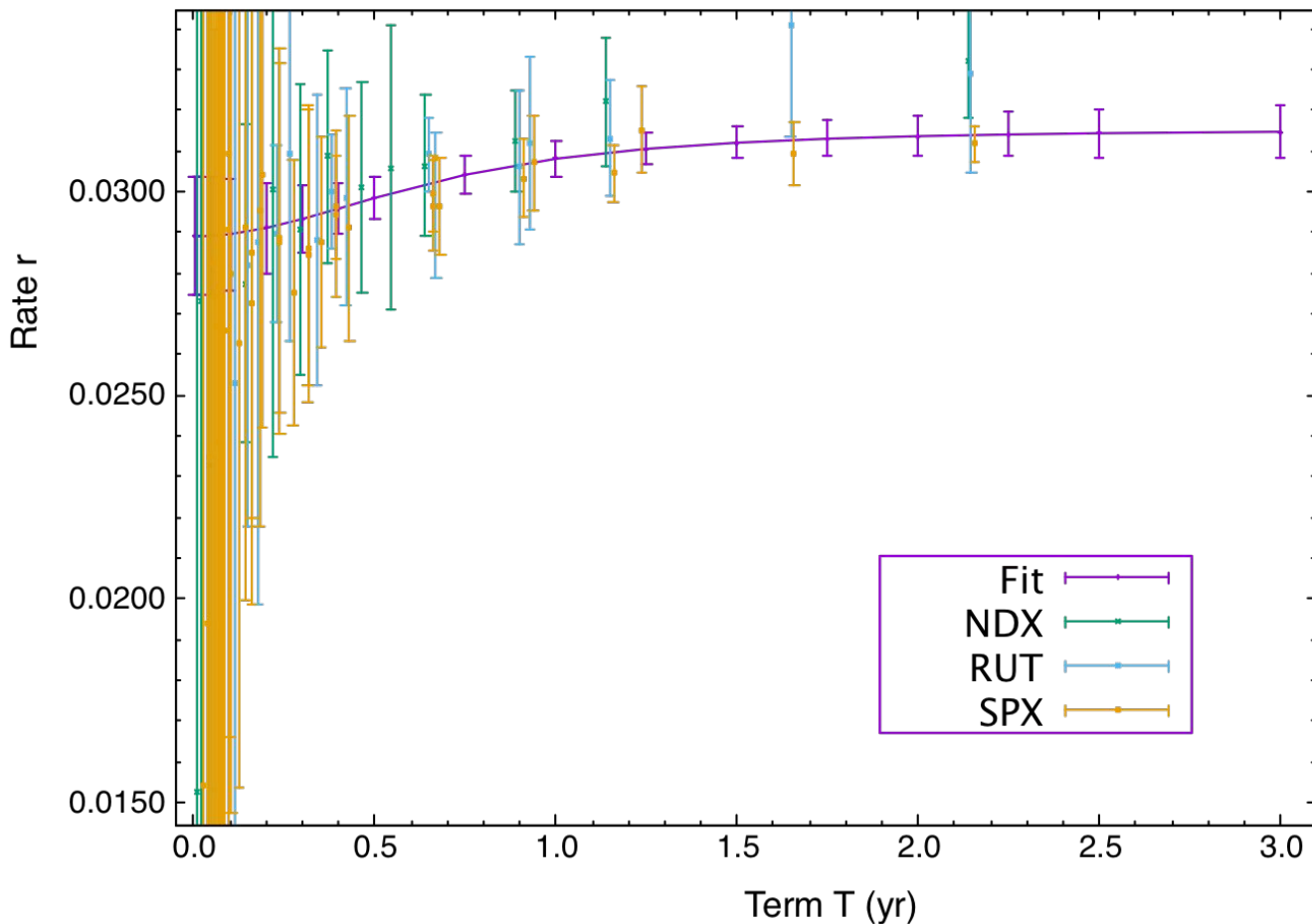
Options-Implied Discount Rates 20191004, chi2Red=0.077



What discount rates
should I use?

SPIBOR

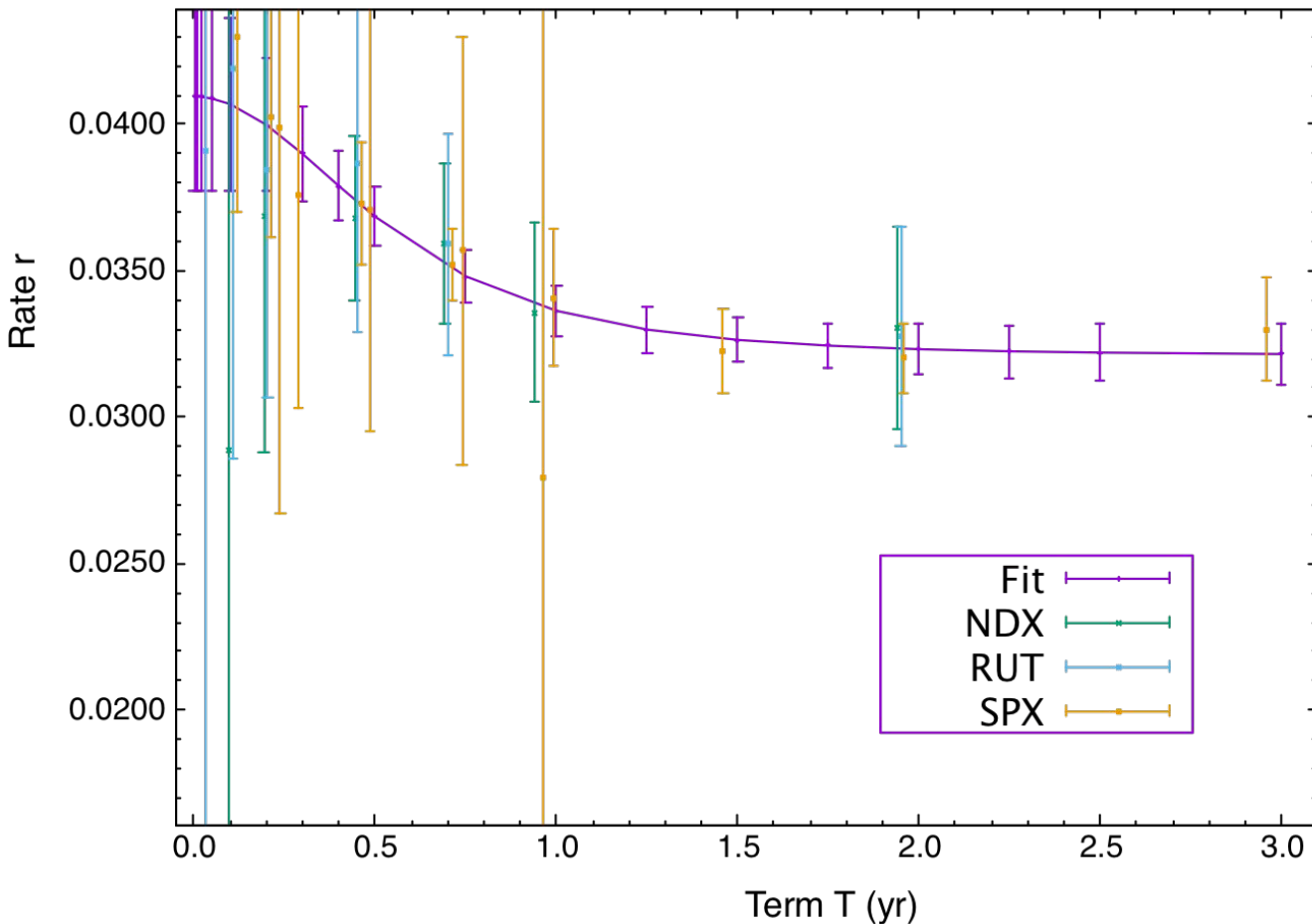
Options-Implied Discount Rates 20181030, chi2Red=0.302



What discount rates should I use?

Maybe they are underlier/
sector dependent?

Options-Implied Discount Rates 20080111, chi2Red=0.140



What discount rates
should I use in **2008** ??

SPIBOR

Vol Curve/Surface Parametrizations

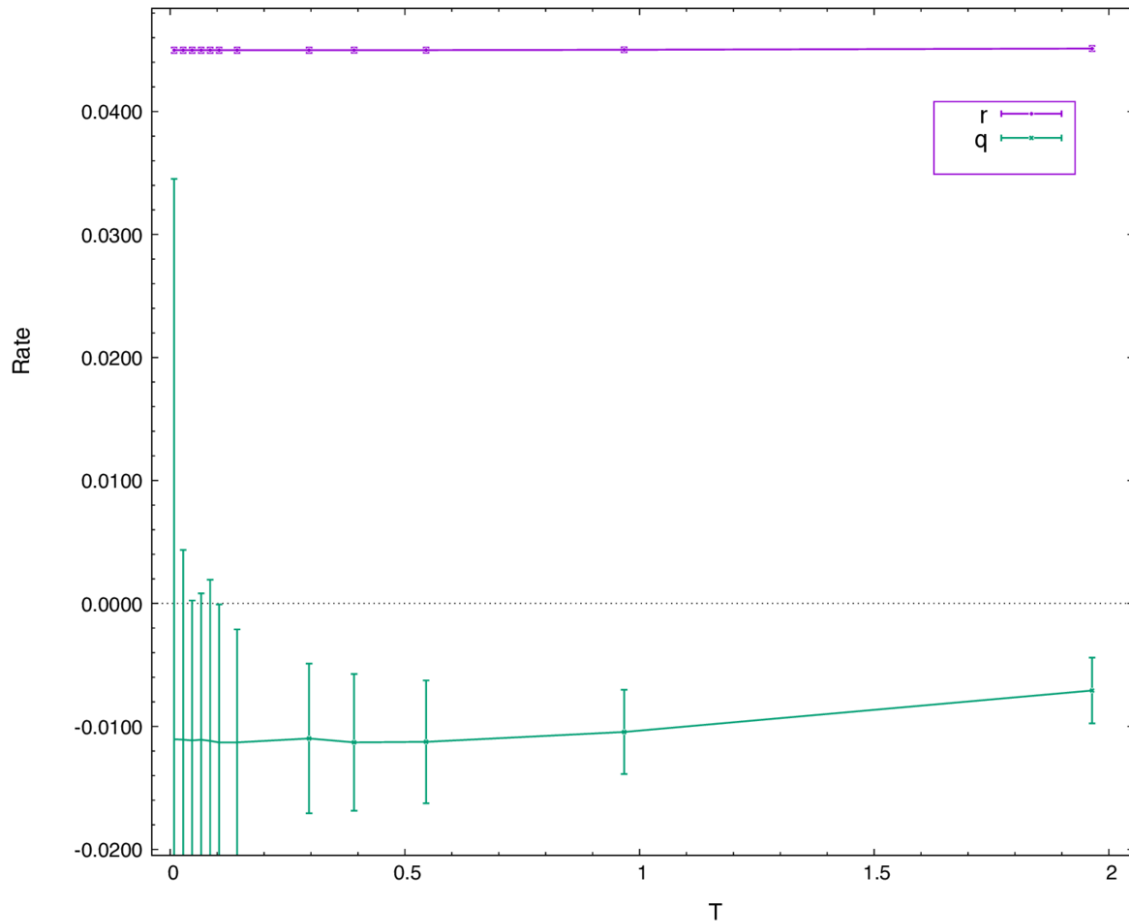
- There are advantages to having a good vol curve parametrization (by strike).
- For current purposes all we have to know is:
 - There are various curves in the public domain, e.g. **S* curves**:
 - i. SVI / S5 (5 params per term)
 - ii. SSVI / S3 (3 params per term)
 - iii. SABR (3 params per term; name is overloaded: model and curve...)
 - The S* curves do not have much shape flexibility, e.g. they do not allow W-shapes as required around events.
 - Hence there are many proprietary curves out there... We have **C* curves**.

Example: IBIT options

- IBIT = iShares Bitcoin ETF, launched 2024-02-15.
- One of the most successful ETF launches in decades: ~\$60bn AUM
- Options started trading 2024-11-19: Very quickly became very liquid.
- We will show:
 - Implied borrow costs $q(T)$.
 - Vol fits: SVI vs C9W, with metrics like **chi2Reds**, **avE5** (avgErrors5)
 - Theoretical prices (“theos”) vs market prices
 - No arbitrage: Densities, total variances

How to imply the borrow cost $q(T)$?

- For European-style options we could use PCP to imply the forward for each expiry, and then $q(T)$ from the forwards.
- For American-style options PCP does not hold. Call and/or put prices could have an early-exercise premium (EEP), even around ATM.
- Time-honored tradition is to use **“American PCP”** as:
 - For strikes K around ATM demand: $\text{volPut}(K) = \text{volCall}(K)$
- This is not really true! One can check this in any real model, like LV, SLV.
- It holds “well enough” if EEP are small-ish compared to spreads for some strikes around ATM — OR if this is what “the market” does!
- For now, imply the borrow such that American PCP holds.
 - If pricing with rate term-structure, bootstrapping from small to large T is needed.



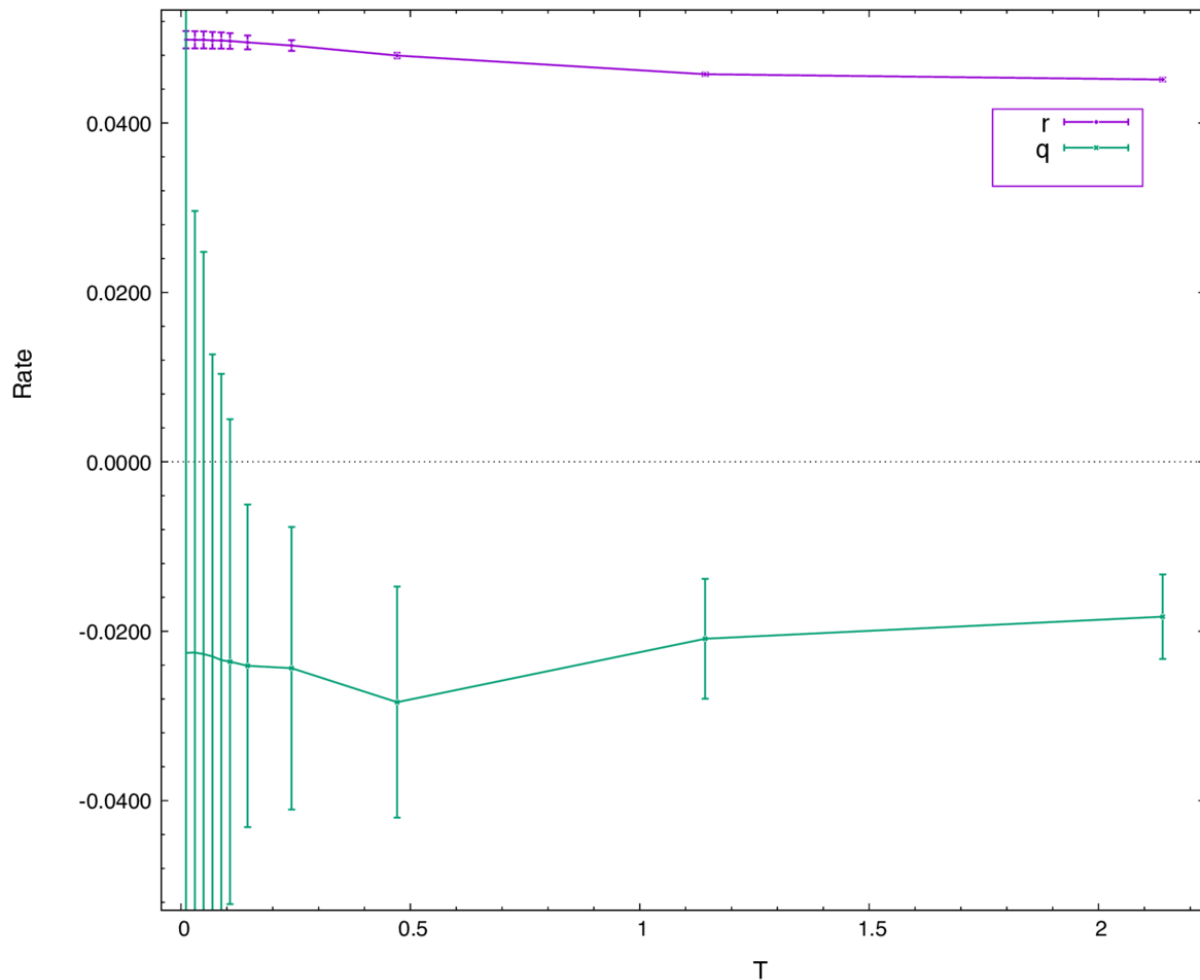
IBIT 2025-01-28

Implied borrow cost by term $q(T)$

The actual borrow cost is +1.2%

Massive demand for upside leverage
leads to much smaller implied $q(T)$!

We also implied the spot here.



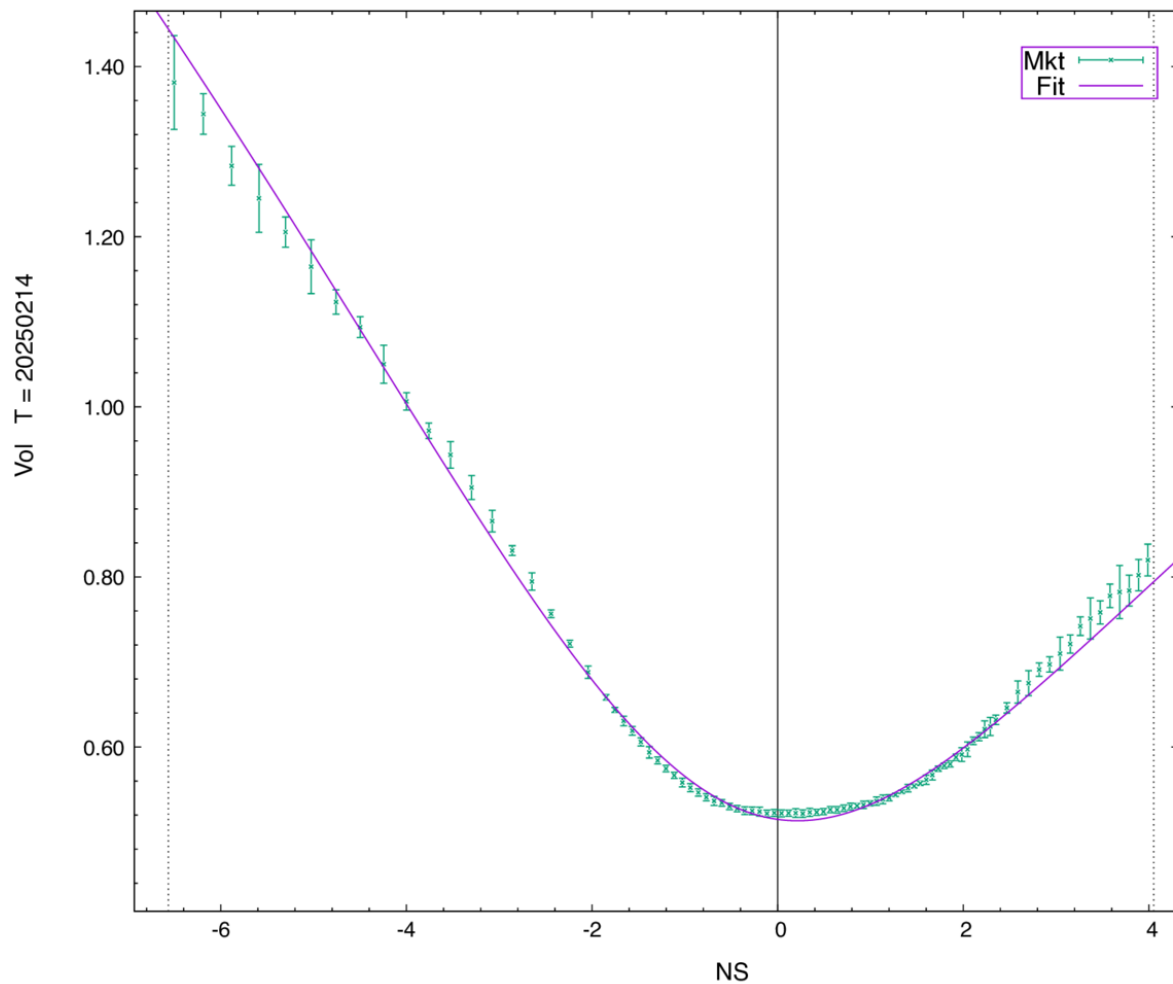
IBIT 2024-11-25

A few days after options trading started

Implied borrow cost by term $q(T)$

Massive demand for upside leverage leads to **much** smaller implied $q(T)$!

We also implied the spot here.

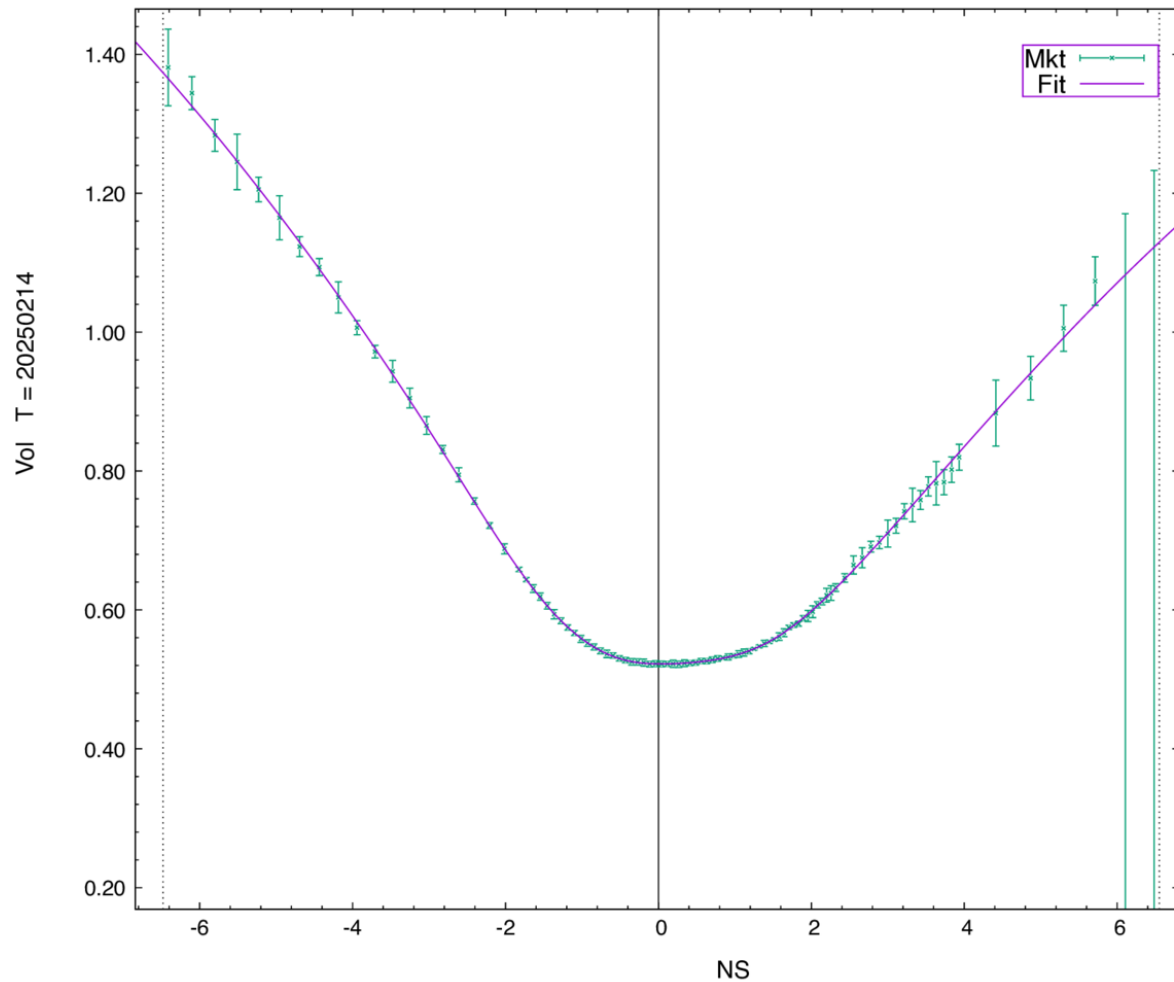


IBIT 20250128 16:00

S5, T = 2w, NS space

S5 = **SVI**

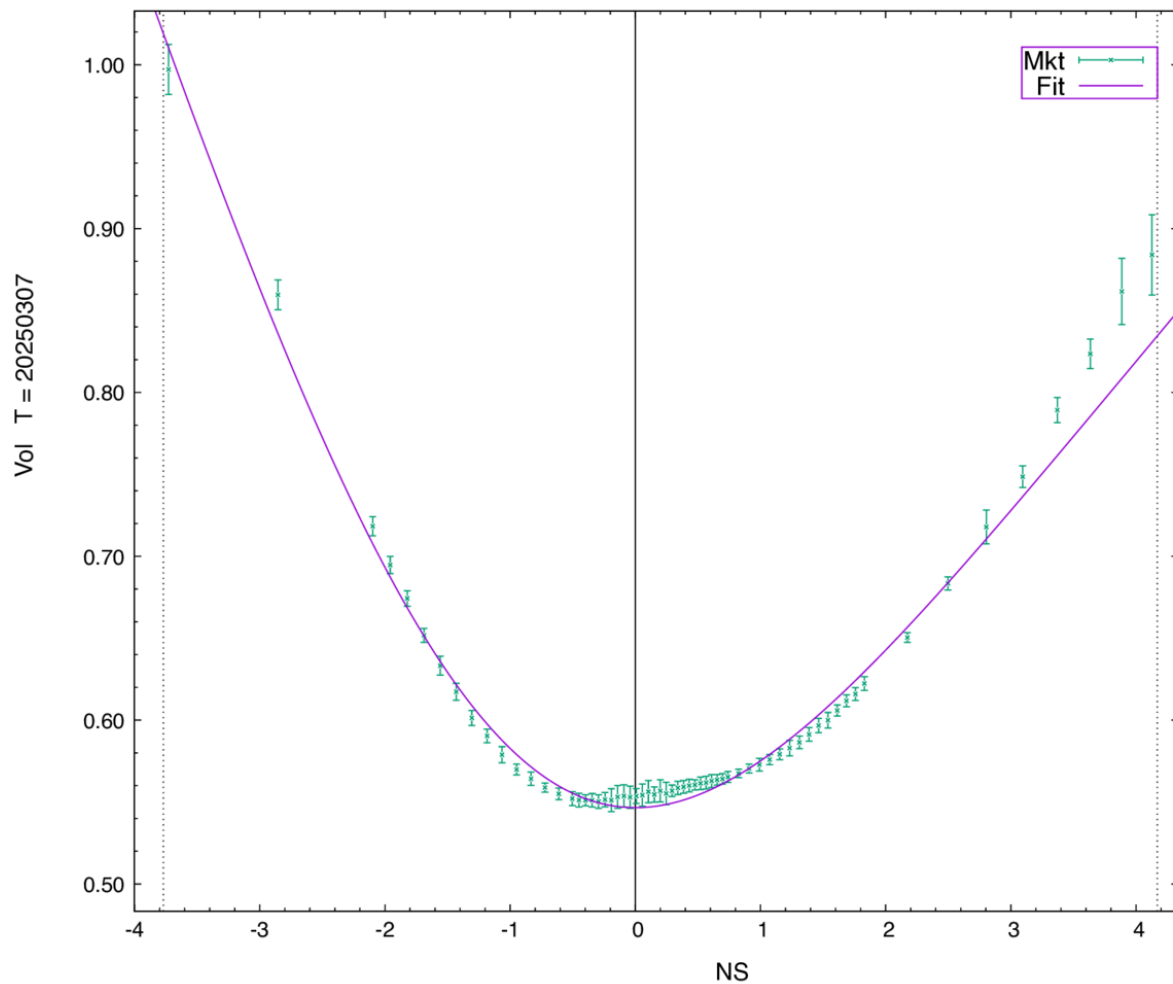
$$z := NS := \frac{\ln(K/F)}{\sigma_0 \sqrt{T}}$$



IBIT 20250128 16:00

C9w, T = 2w, NS space

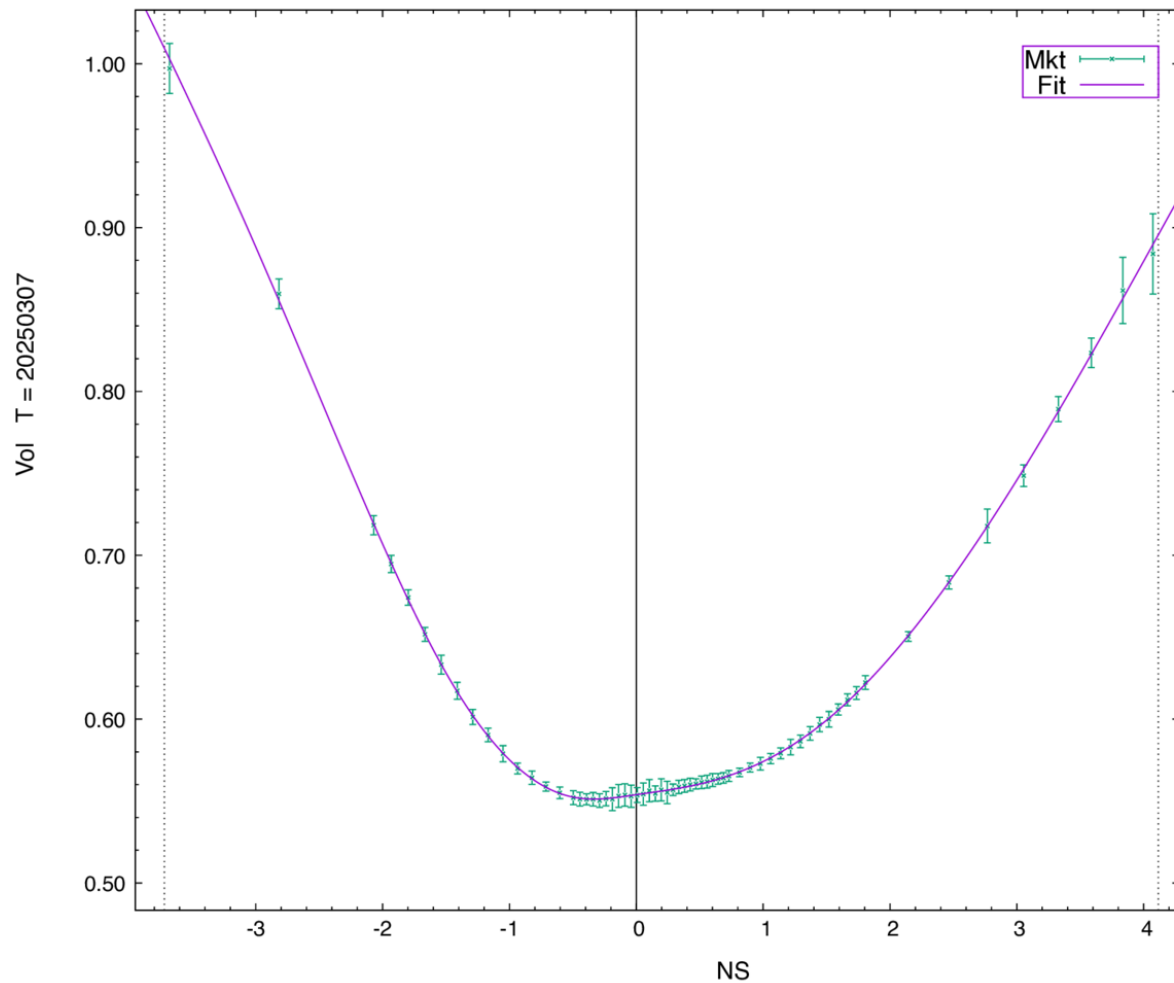
Fit is 15-20x better than SVI



IBIT 20250128 16:00

S5 T = 5w, NS space

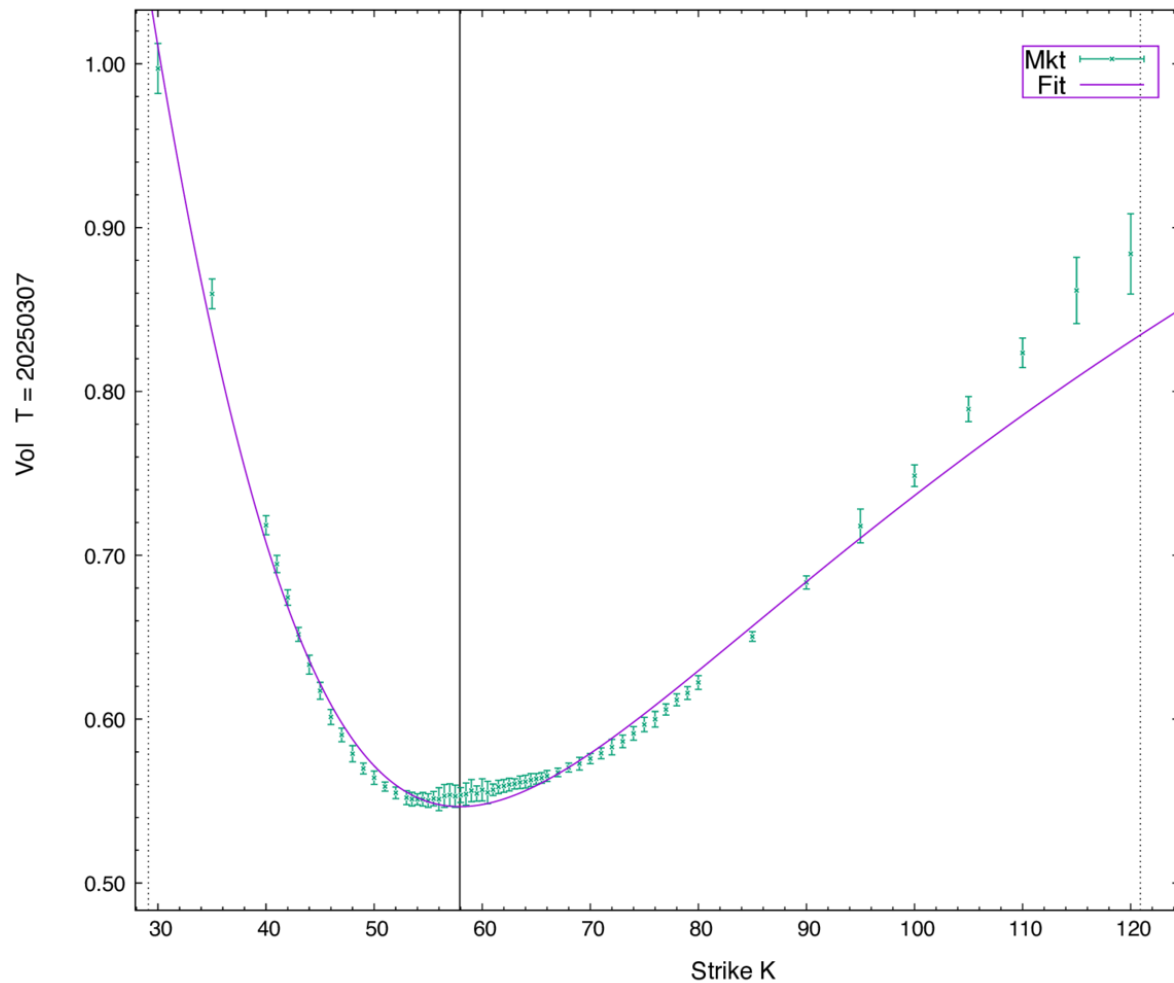
$$z := NS := \frac{\ln(K/F)}{\sigma_0 \sqrt{T}}$$



IBIT 20250128 16:00

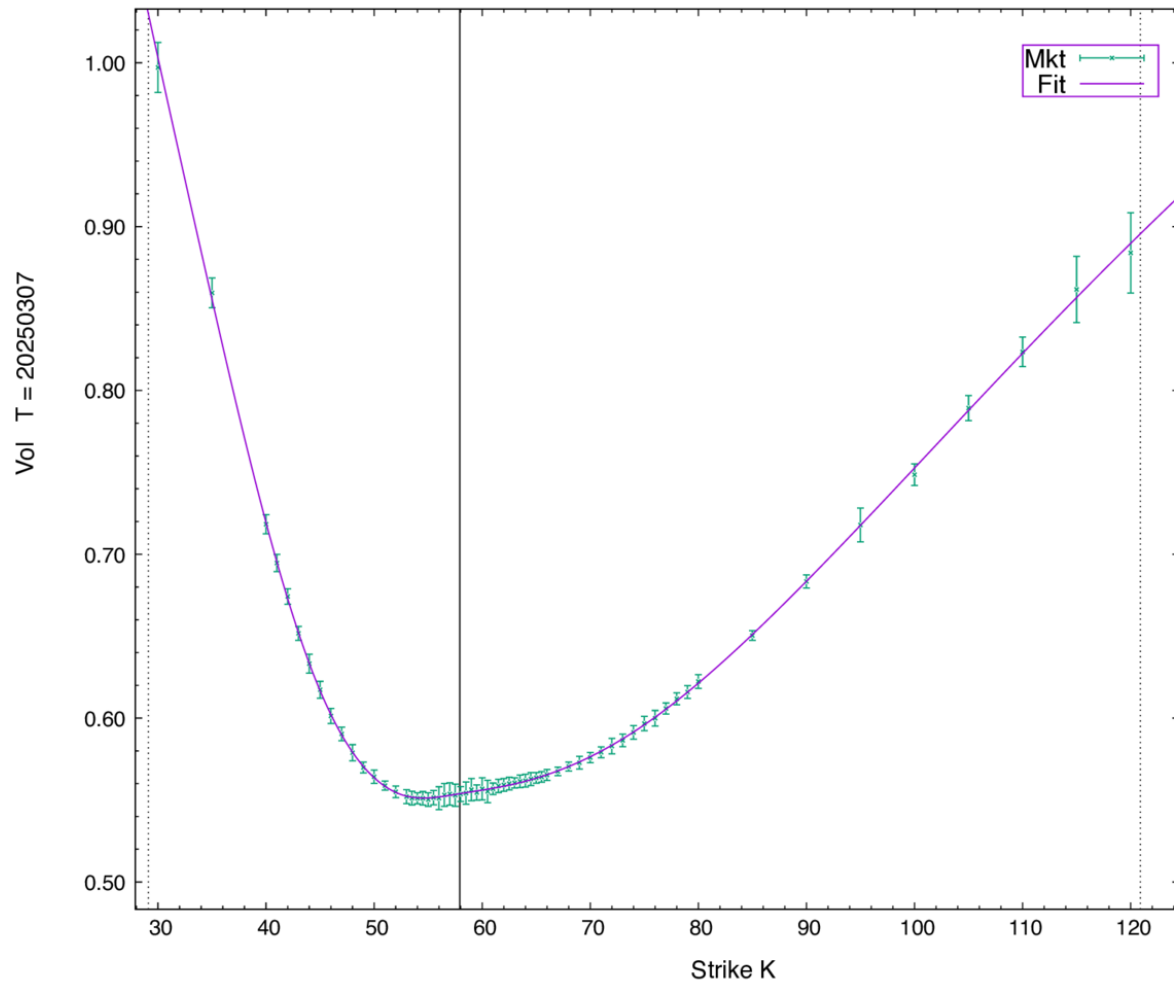
C9w, T = 5w, NS space

Fit is 13-70x better than SVI



IBIT 20250128 16:00

S5 T = 5w, K space

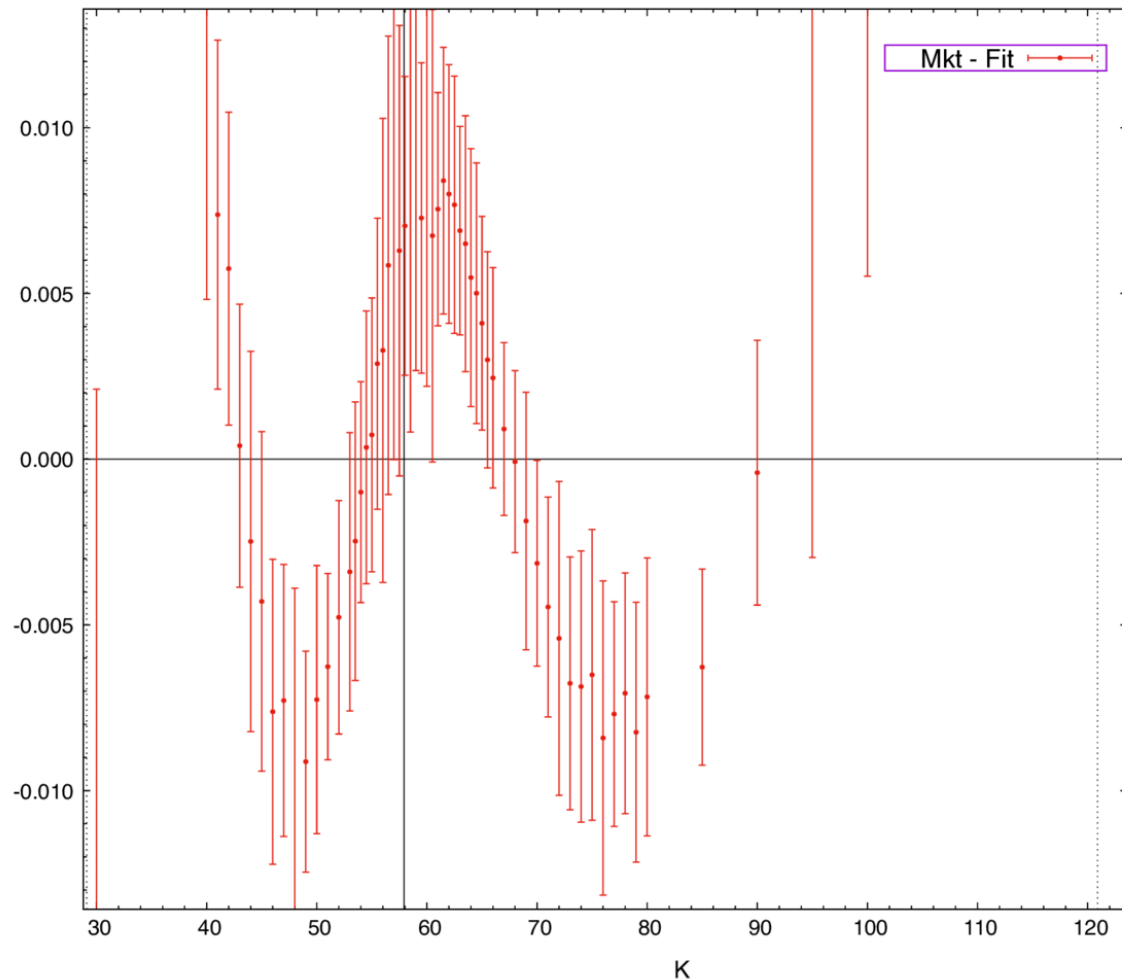


IBIT 20250128 16:00

C9w, T = 5w, K space

Fit is 13-70x better than SVI

Vol diff T = 20250307

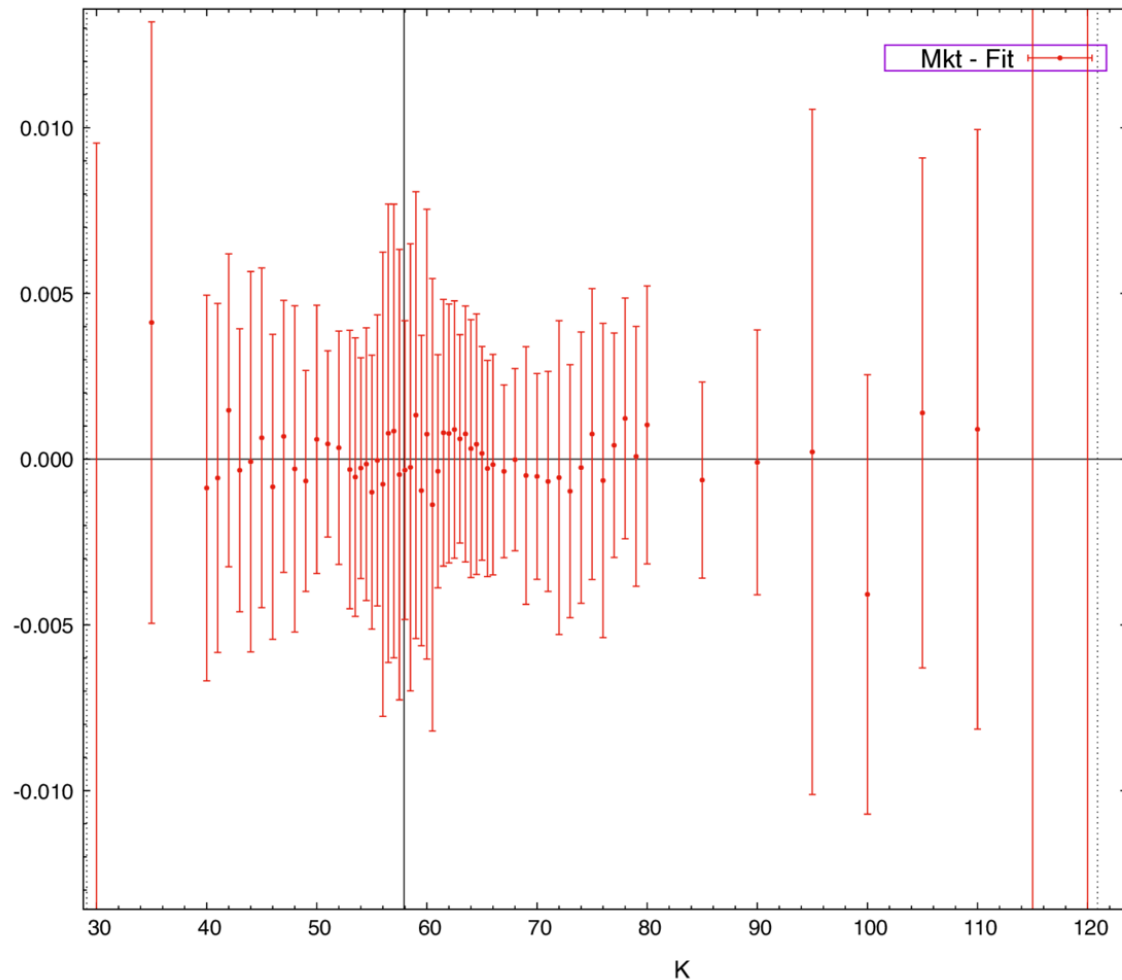


IBIT 20250128 16:00

S5 T = 5w, K space

"Vol diff" plot

Vol diff T = 20250307



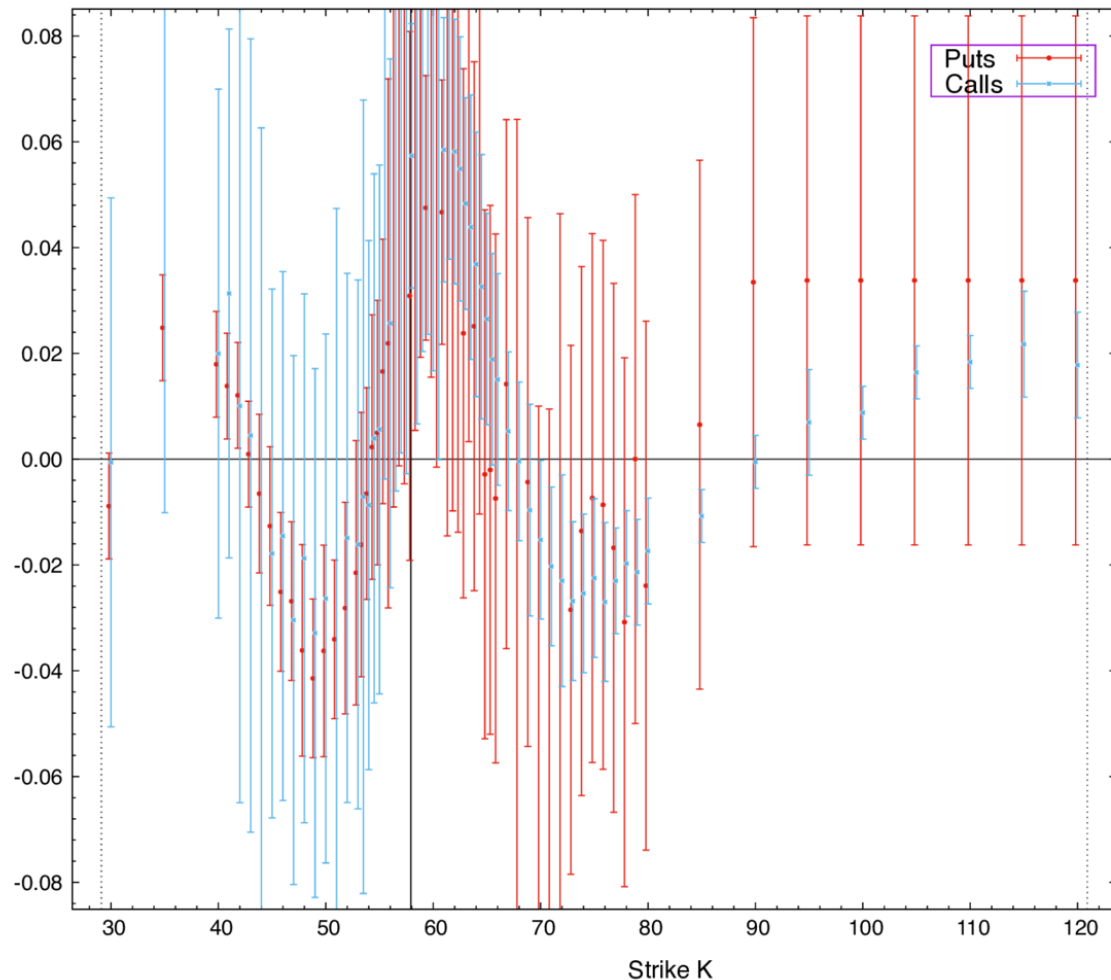
IBIT 20250128 16:00

C9w, T = 5w, K space

“Vol diff” plot

Fit is 13-70x better than SVI

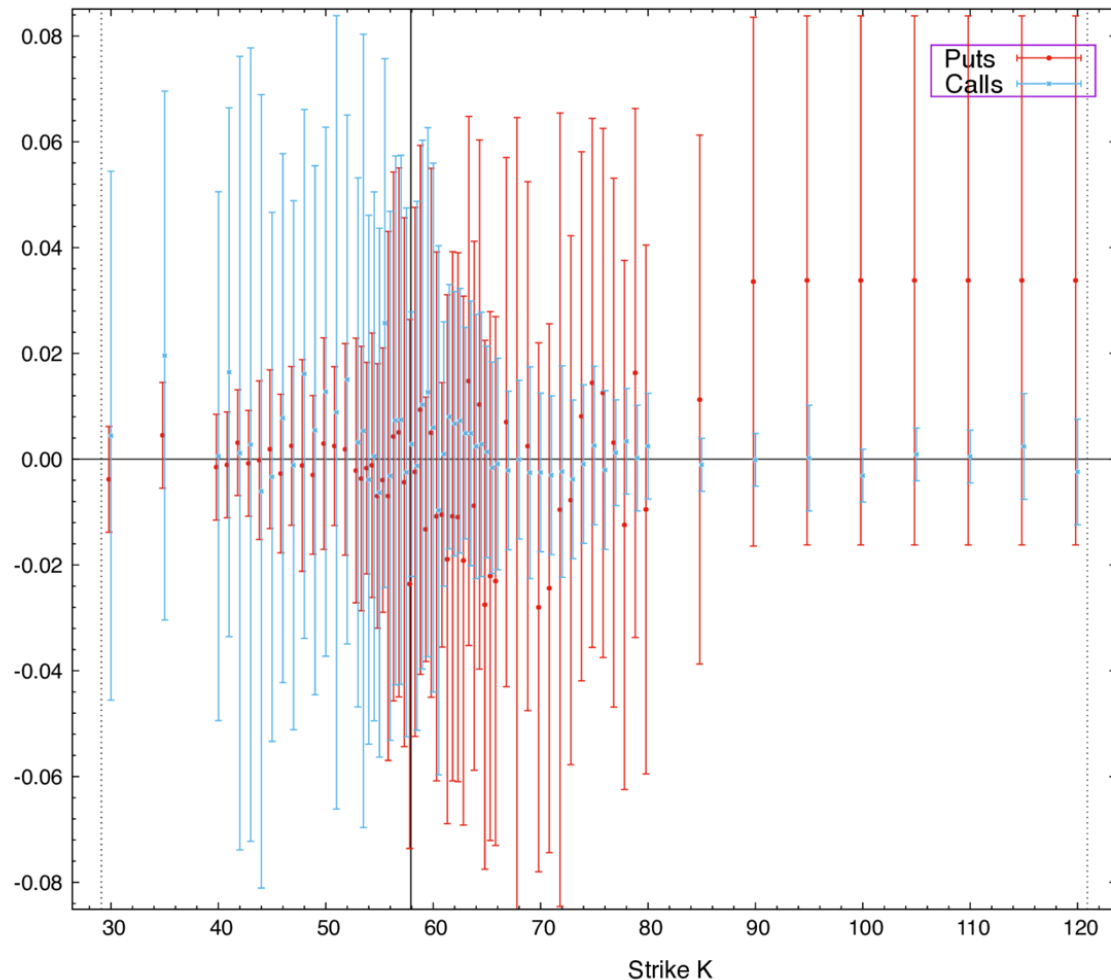
Mkt - Theo T = 20250307



IBIT 20250128 16:00

S5 T = 5w, K space

"Price diff" plot: The ultimate test!

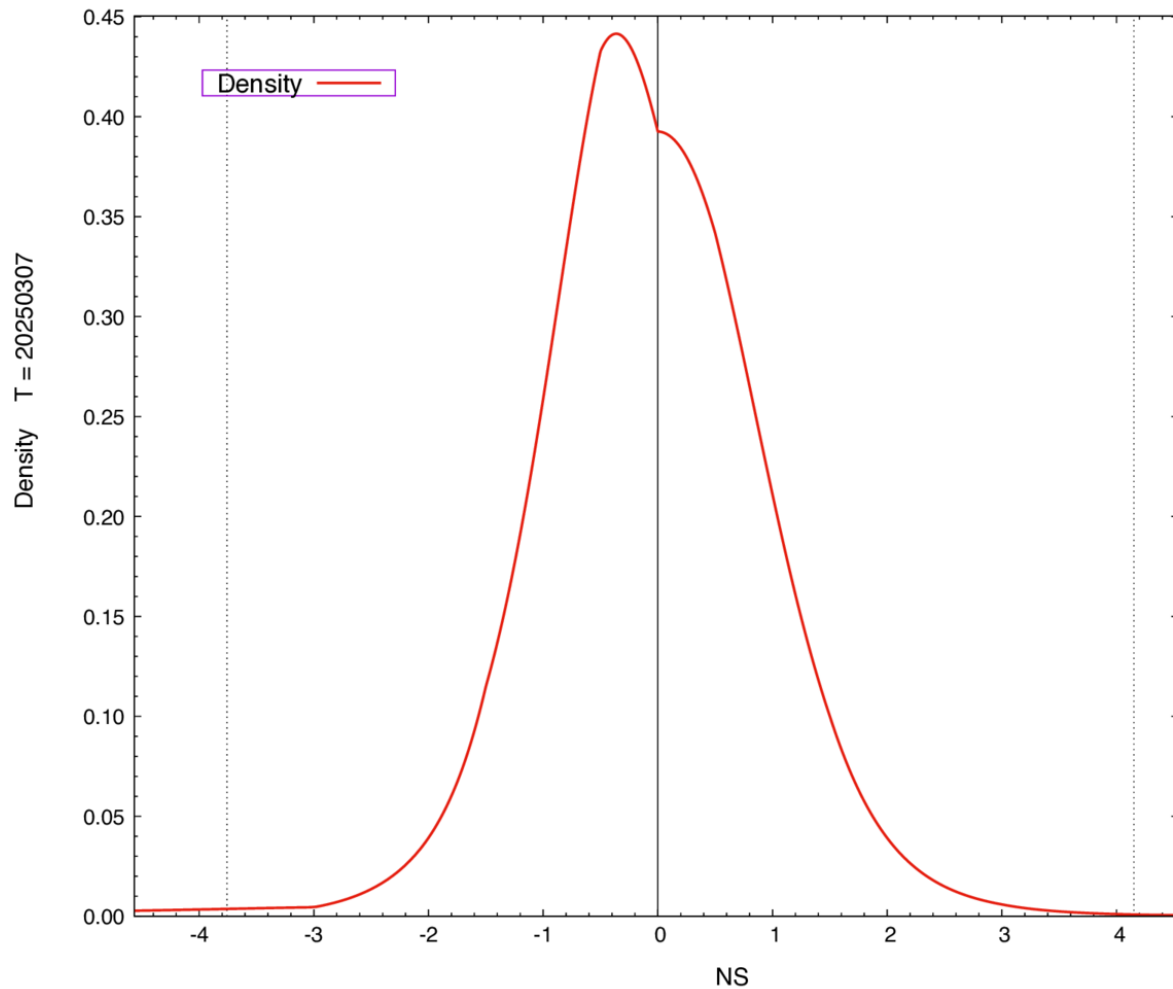


IBIT 20250128 16:00

C9w, T = 5w, K space

"Price diff" plot: The ultimate test!

Fit is 13-70x better than SVI

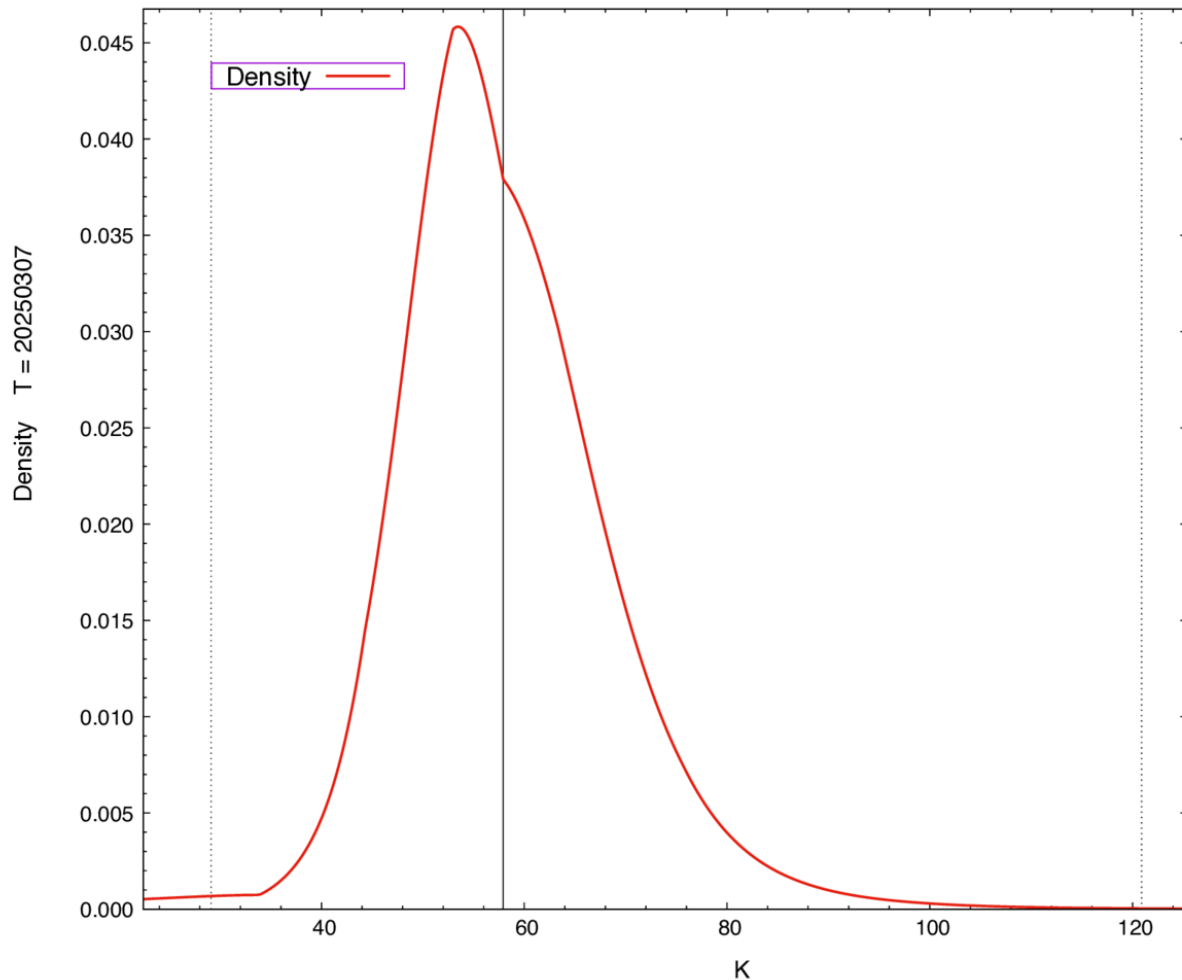


IBIT 20250128 16:00

C9w, T = 5w, NS space

Implied density

A pretty fat put wing...

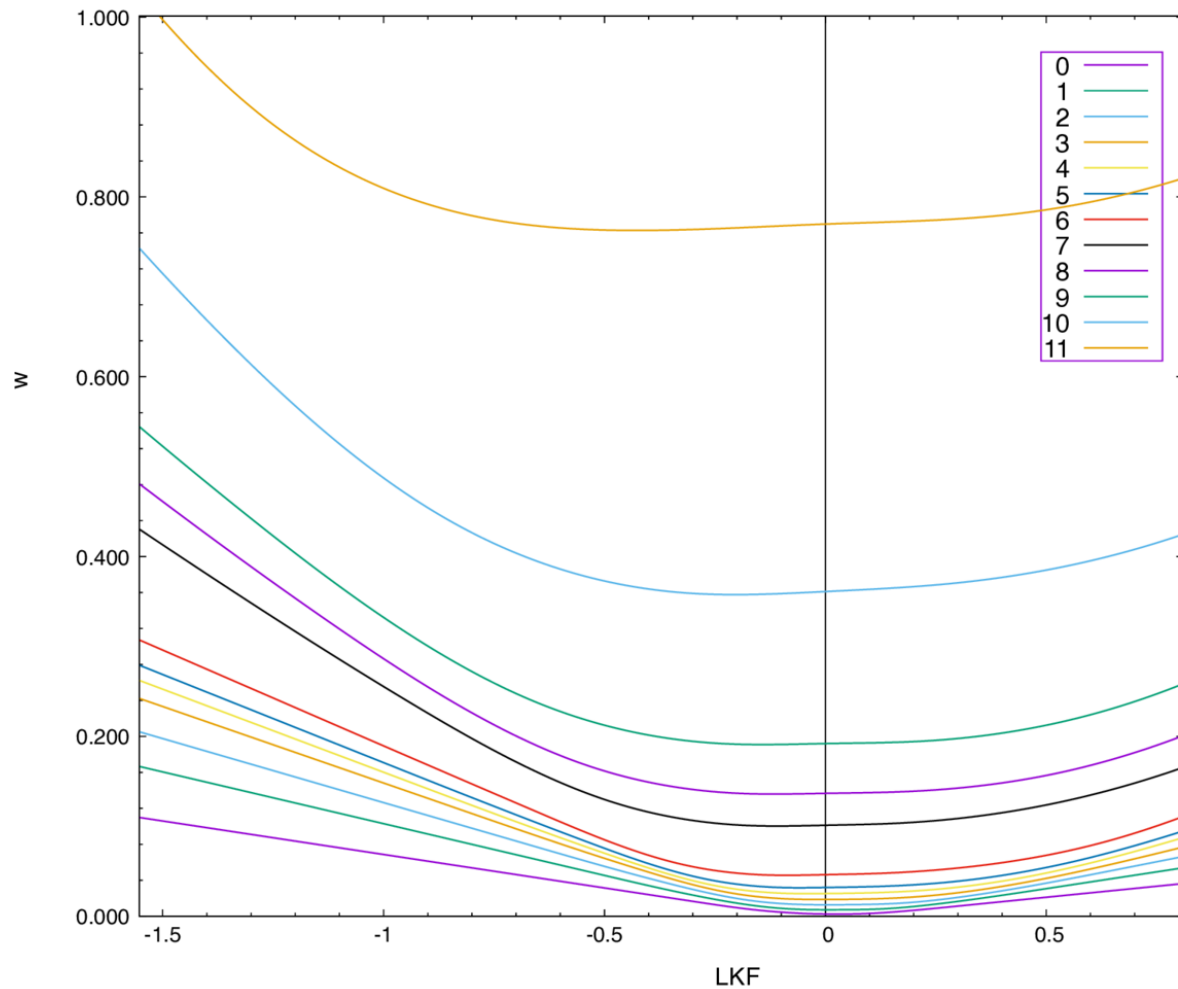


IBIT 20250128 16:00

C9w, T = 5w, K space

Implied density

A pretty fat put wing...

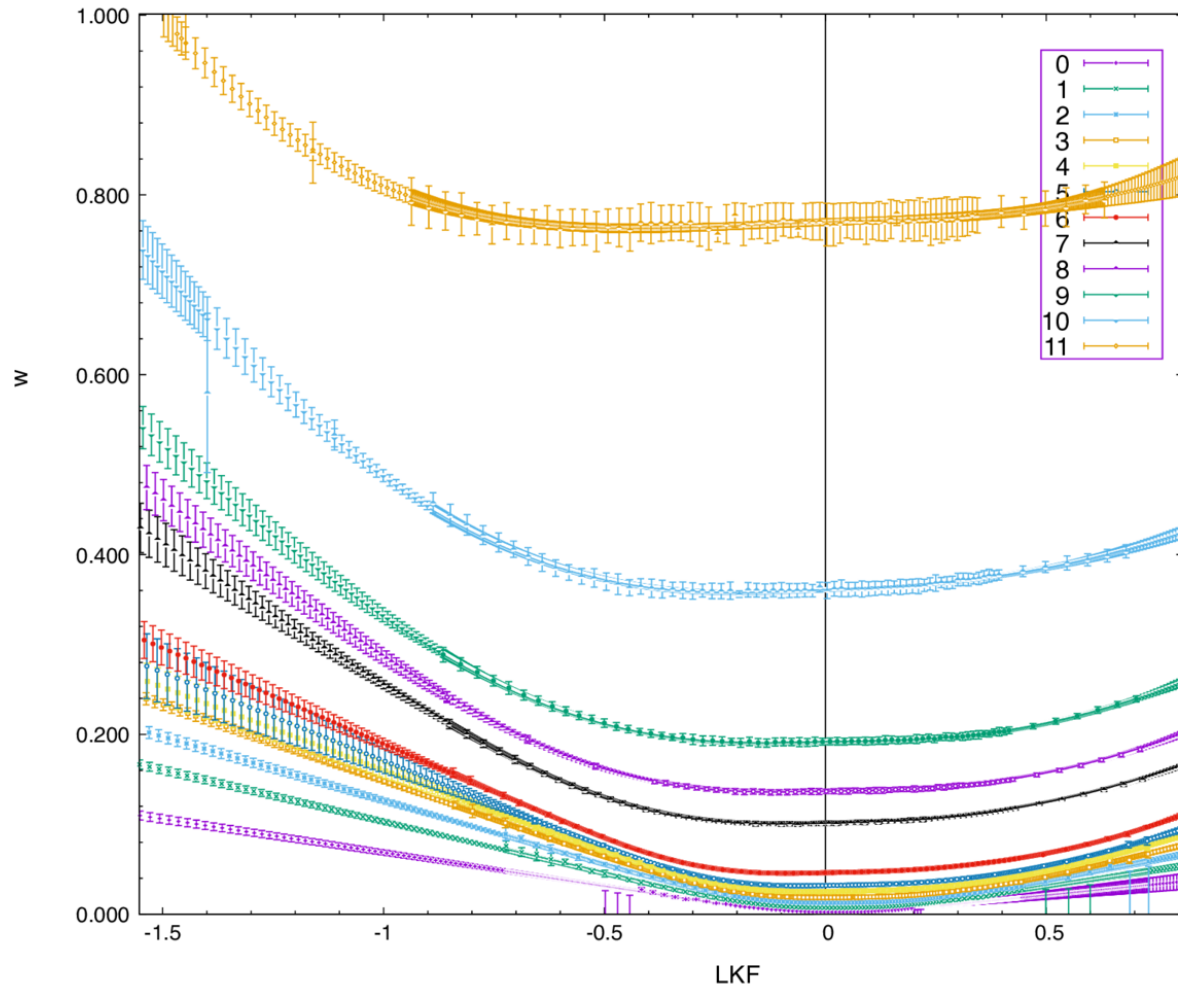


IBIT 20250128 16:00

Total Variance plot

No calendar arbitrage!

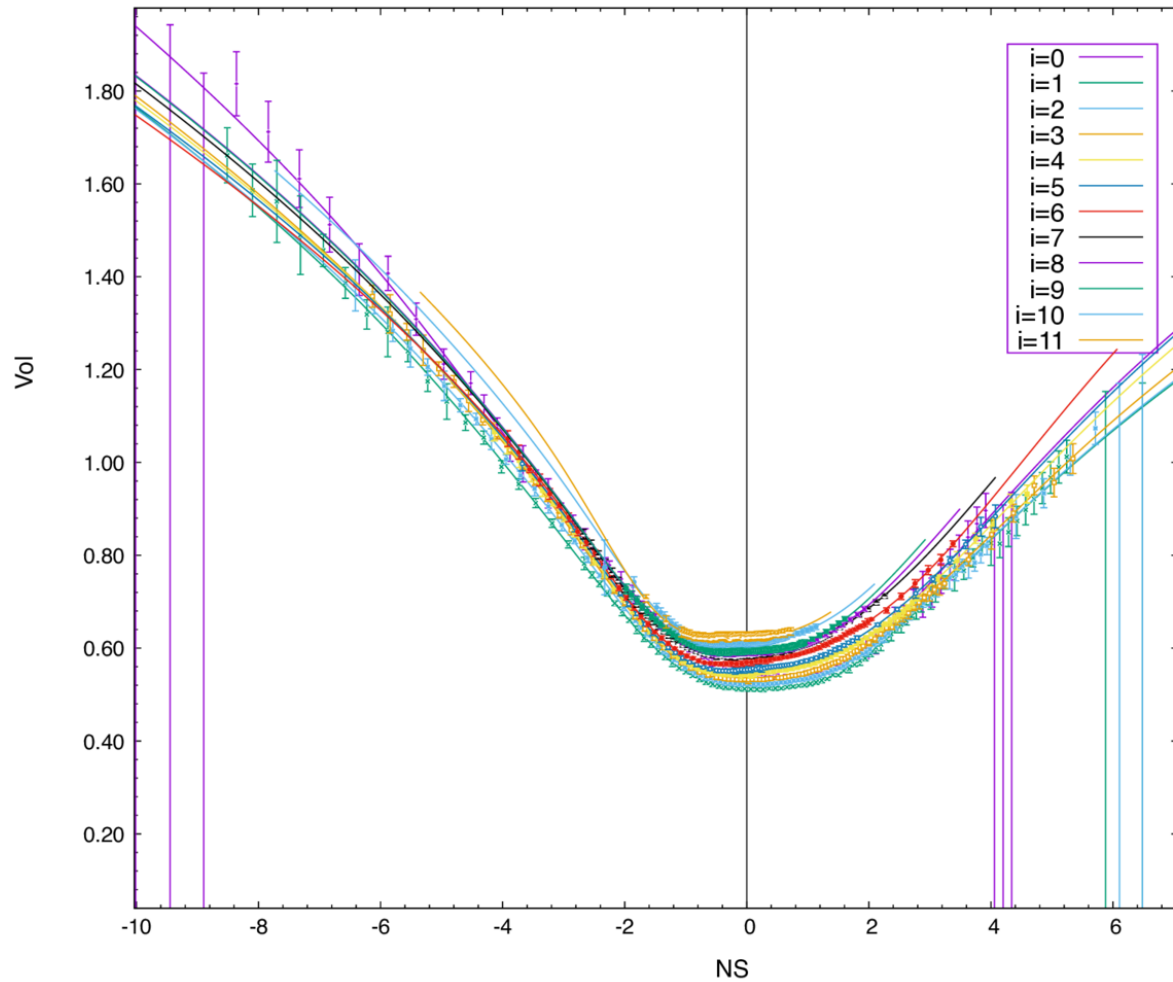
$$w(T, K) := \sigma(T, K)^2 T$$



IBIT 20250128 16:00

Total Variance plot

With error bars!



IBIT 20250128 16:00

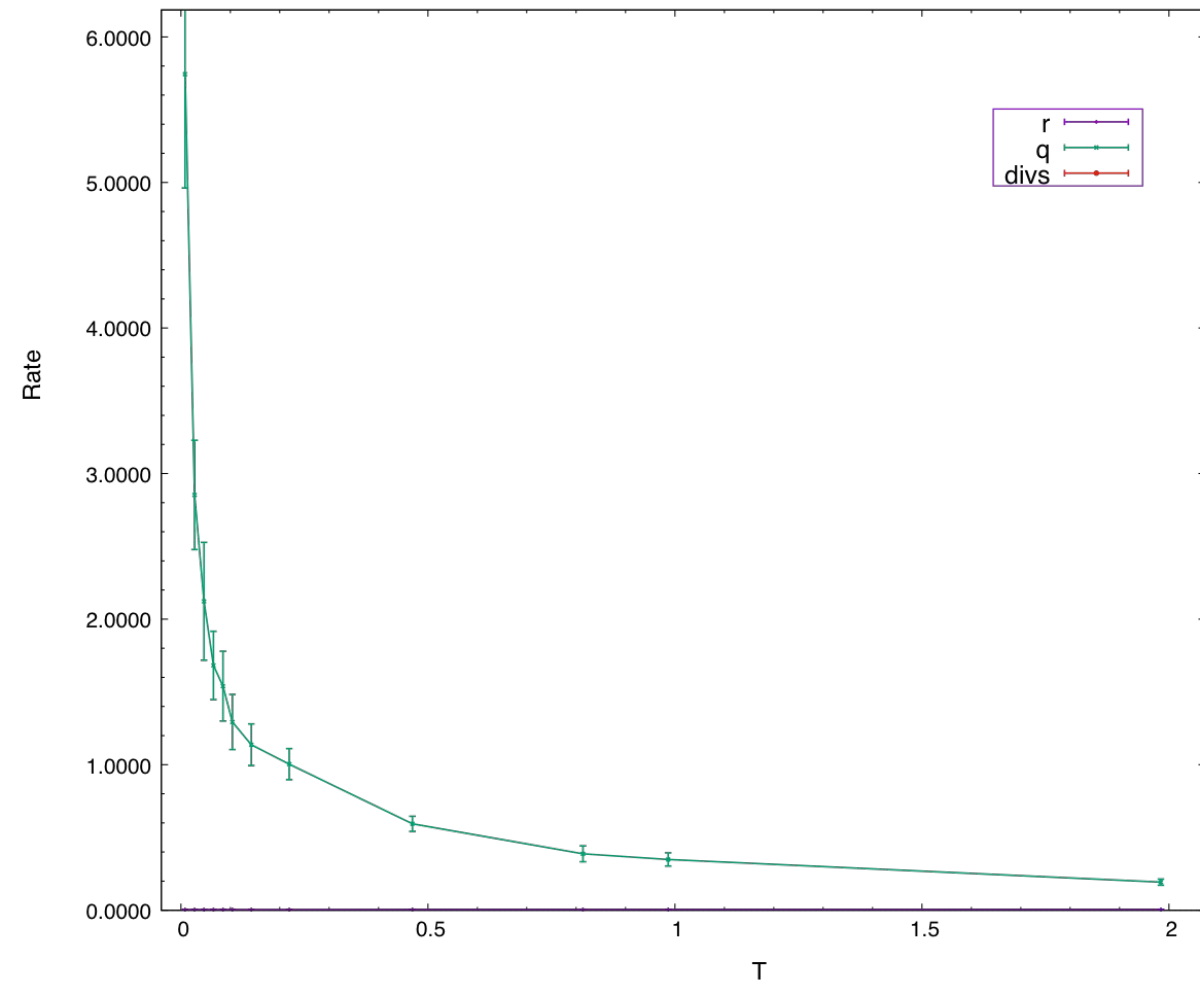
All vols by NS

IBIT options: Conclusions

- Implied borrows can be very different from actual (overnight) borrow fees charged by agent banks/prime brokers.
- As an options market becomes liquid, SVI will very quickly not be flexible enough to match the market in a bias-free manner (Klassen's law).

Gamestop during the 2021 short squeeze

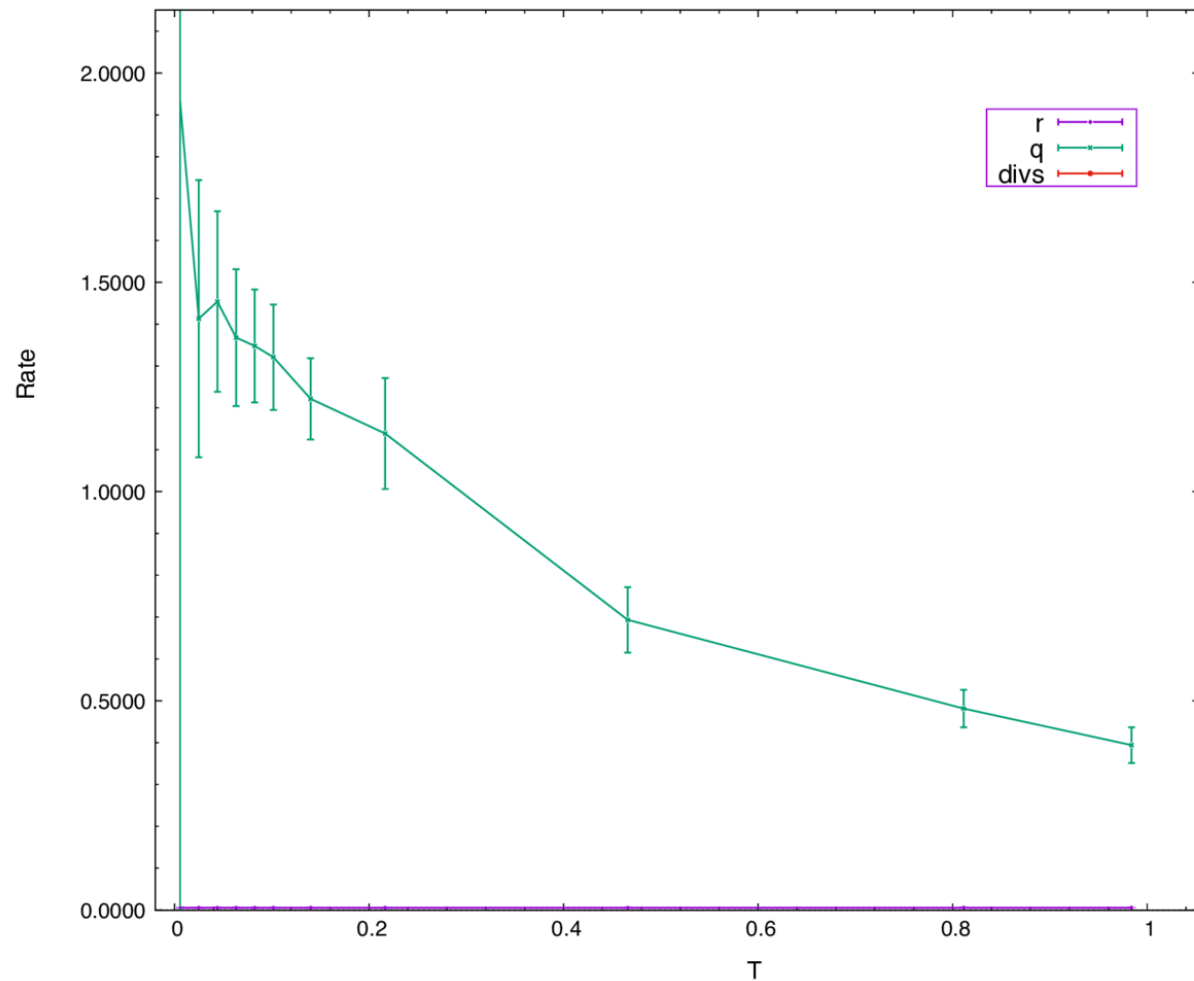
- GME was one of the most prominent meme stocks during the 2021 craziness.
- It made Roaring Kitty & reddit/WallStreetBets famous, killed Melvin Capital, lead to trading restrictions on Robinhood, numerous lawsuits, and conspiracy theories — and maybe(?) some better understanding by the retail public of how margin accounts and short selling works...
- Both stock and options trading exploded — supposedly more premium traded in GME than in SPX options for a couple of days!
- See wikipedia or my 2021 LinkedIn post for details.



Gamestop 2021-01-26

Implied Borrow TS: $q(T)$

Up to 600% !

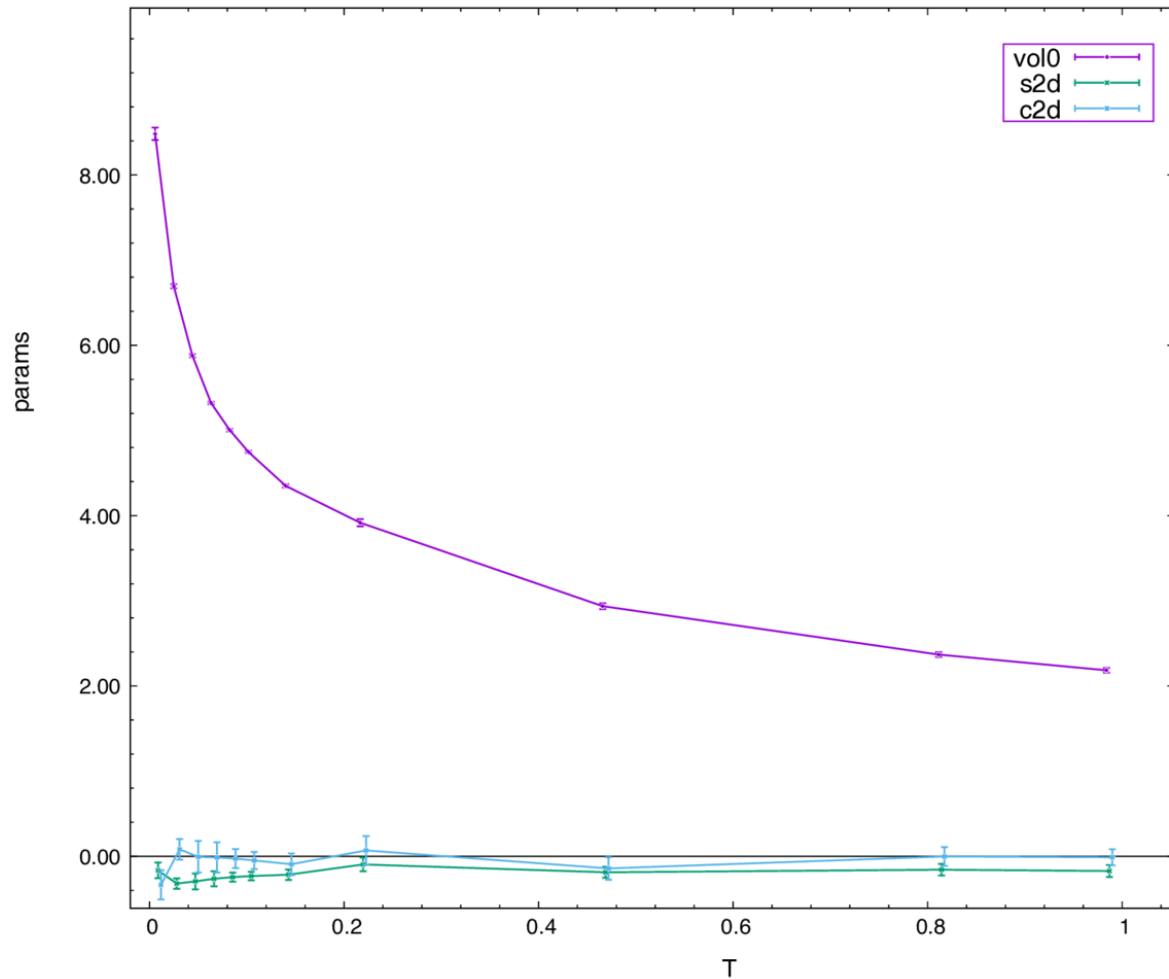


Gamestop 2021-01-27

The day it more than doubled...

Implied Borrow TS: $q(T)$

Up to 180% !

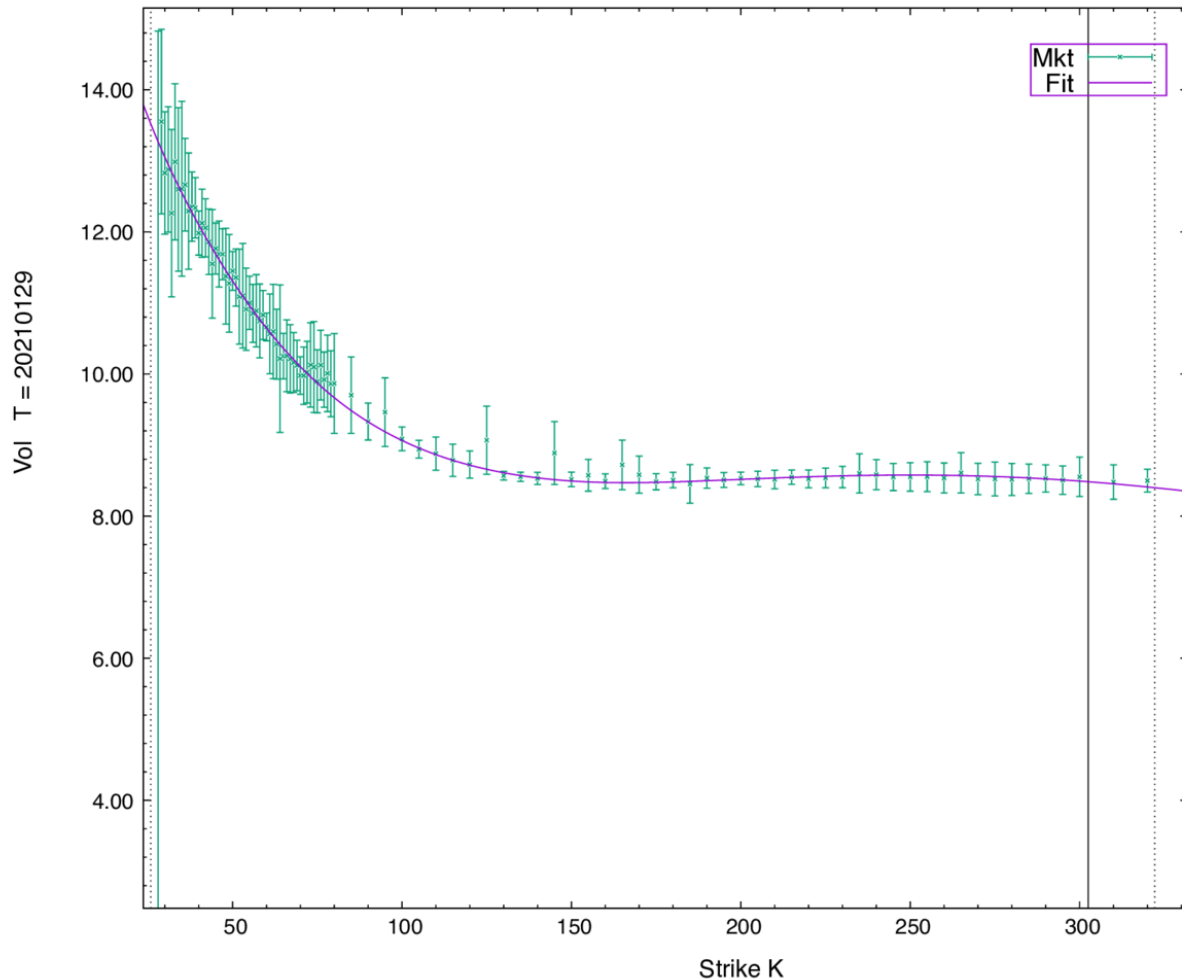


Gamestop 2021-01-27

The day it more than doubled...

Implied Parameter TS

ATM vol above 800% !

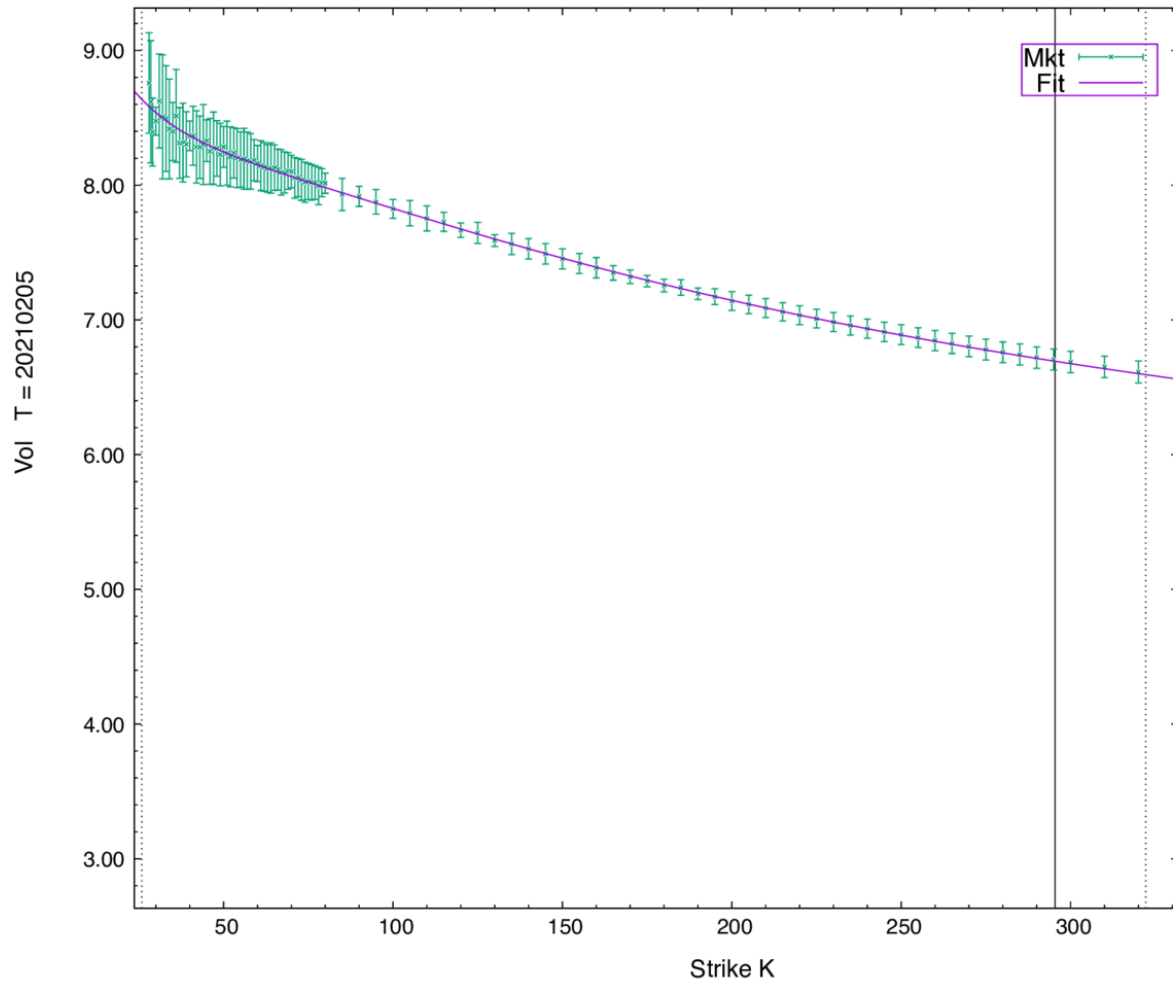


Gamestop 2021-01-27

The day it more than doubled...

Implied vol of 1st Term

It almost ran out of strikes on call side...

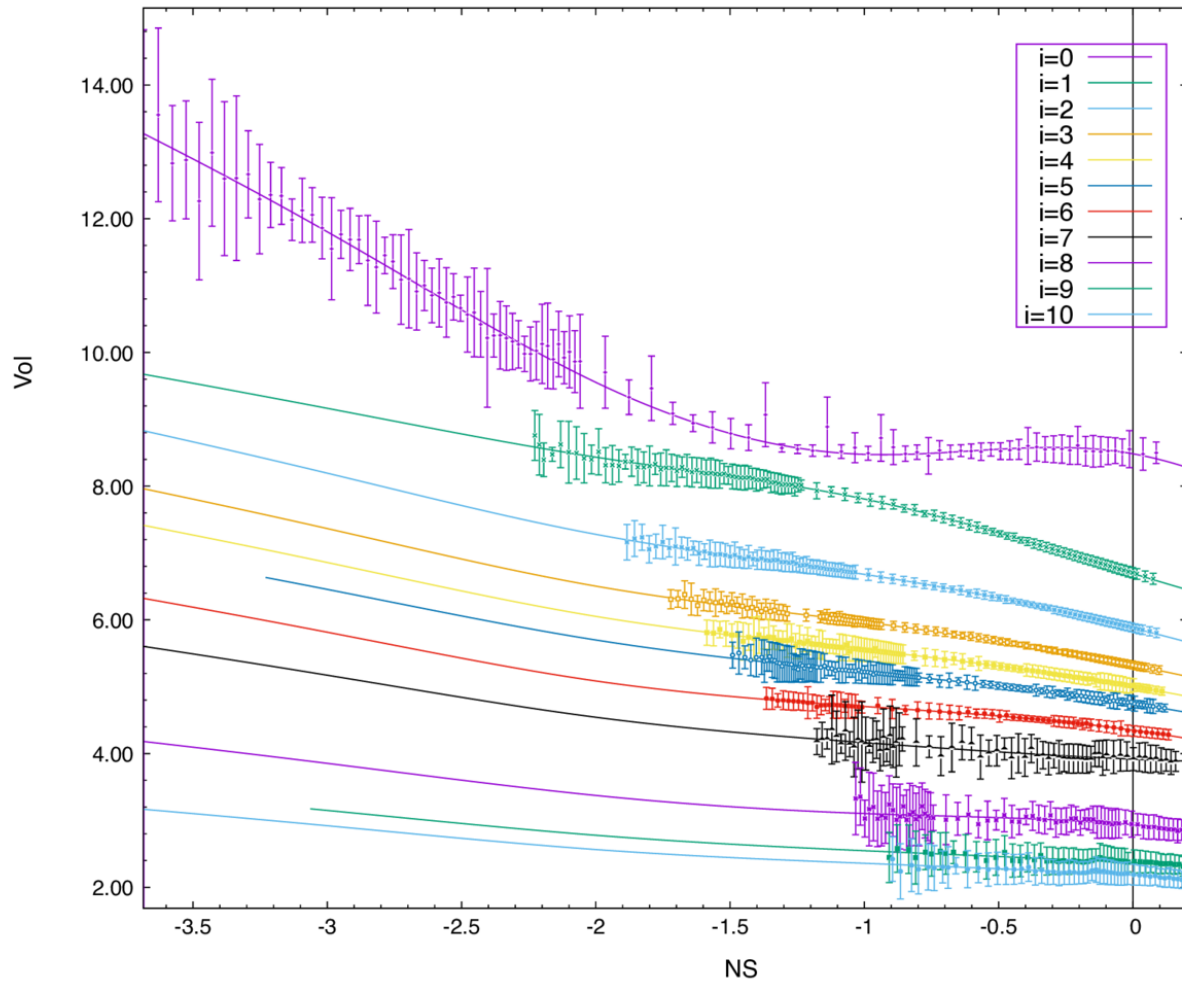


Gamestop 2021-01-27

The day it more than doubled...

Implied vol of 2nd Term

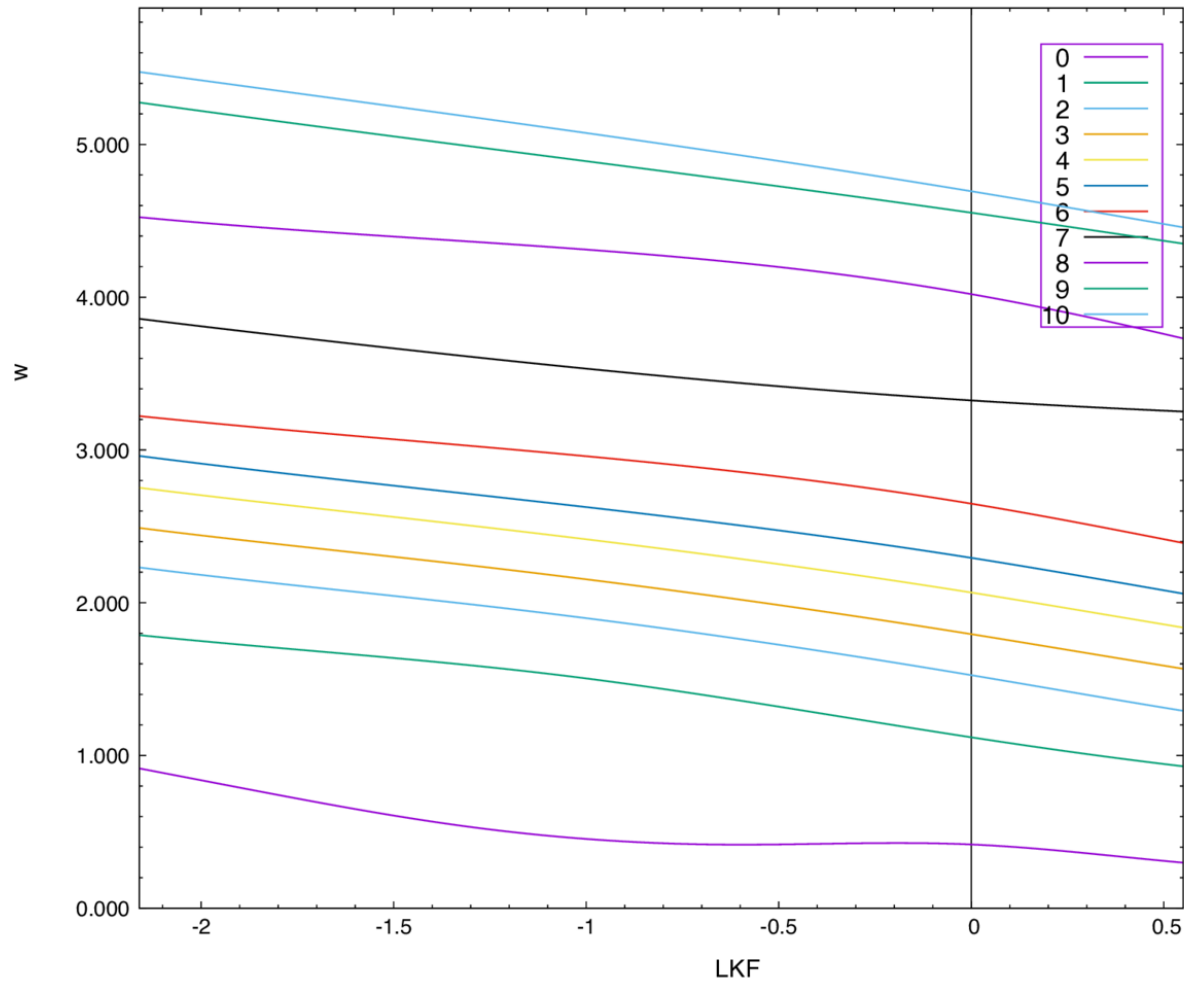
It almost ran out of strikes on call side...



Gamestop 2021-01-27

The day it more than doubled...

Implied vol of all terms by NS

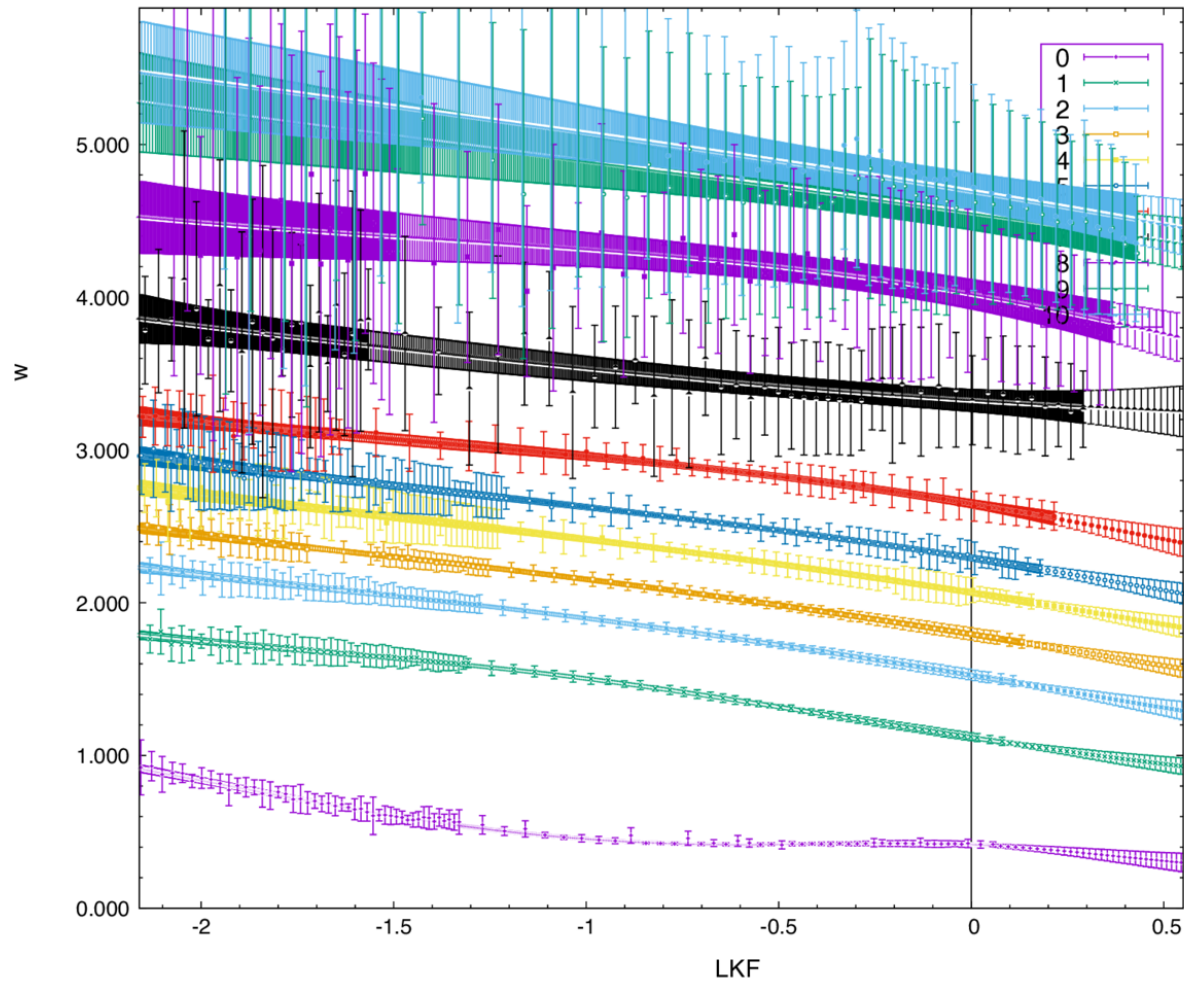


Gamestop 2021-01-27

The day it more than doubled...

Total Variance plot

No calendar arb

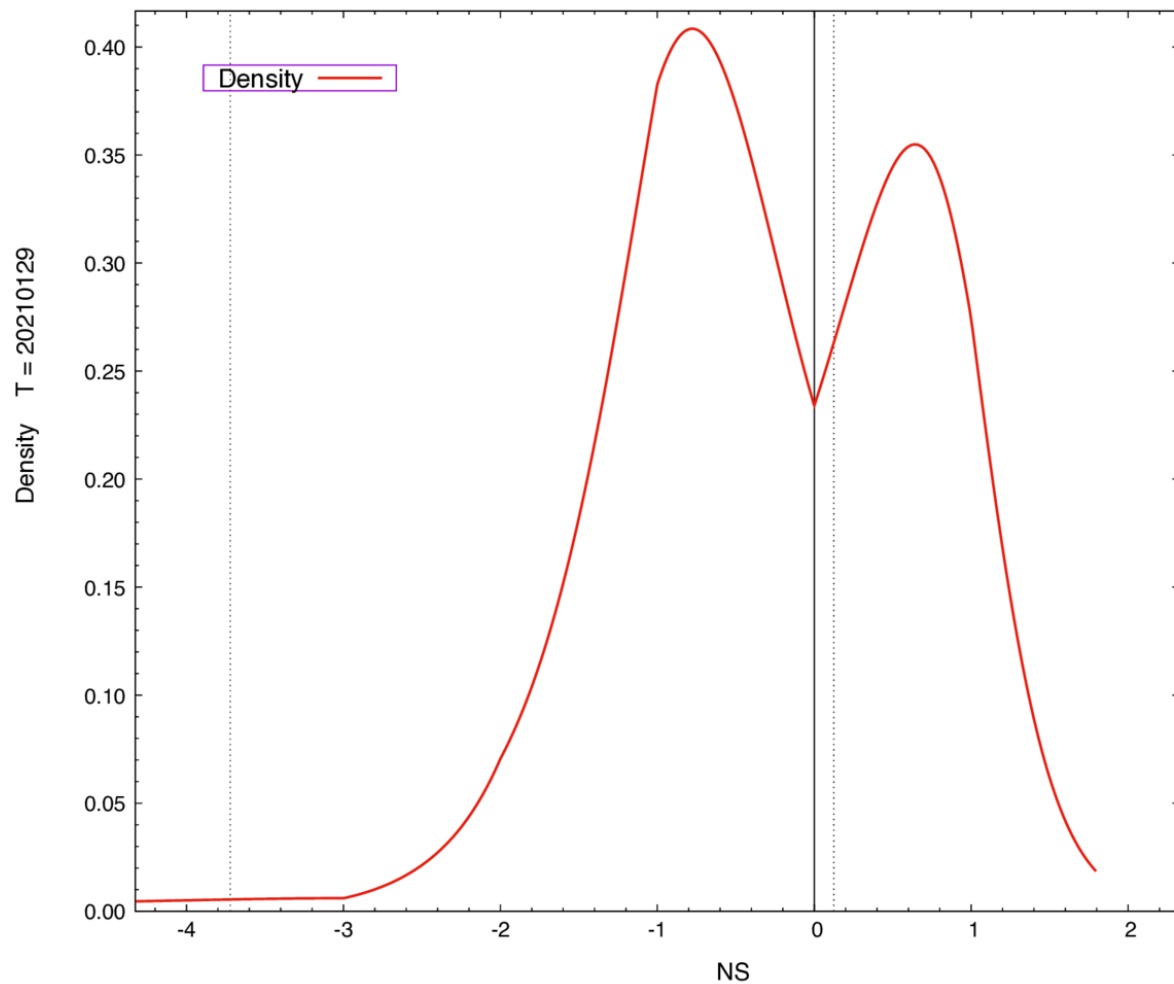


Gamestop 2021-01-27

The day it more than doubled...

Total Variance plot
with error bars

No calendar arb



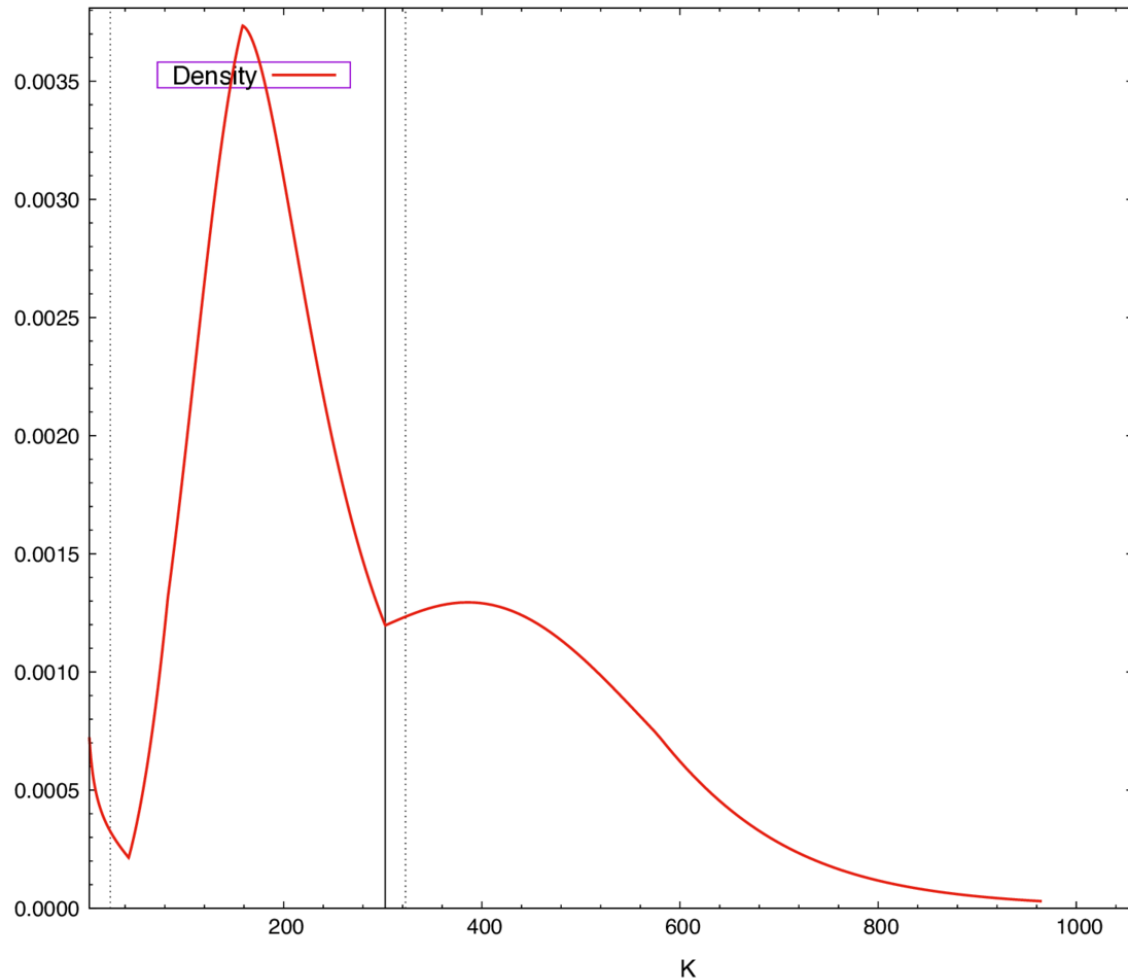
Gamestop 2021-01-27

The day it more than doubled...

Implied density of 1st Term

NS-space

Density T = 20210129



Gamestop 2021-01-27

The day it more than doubled...

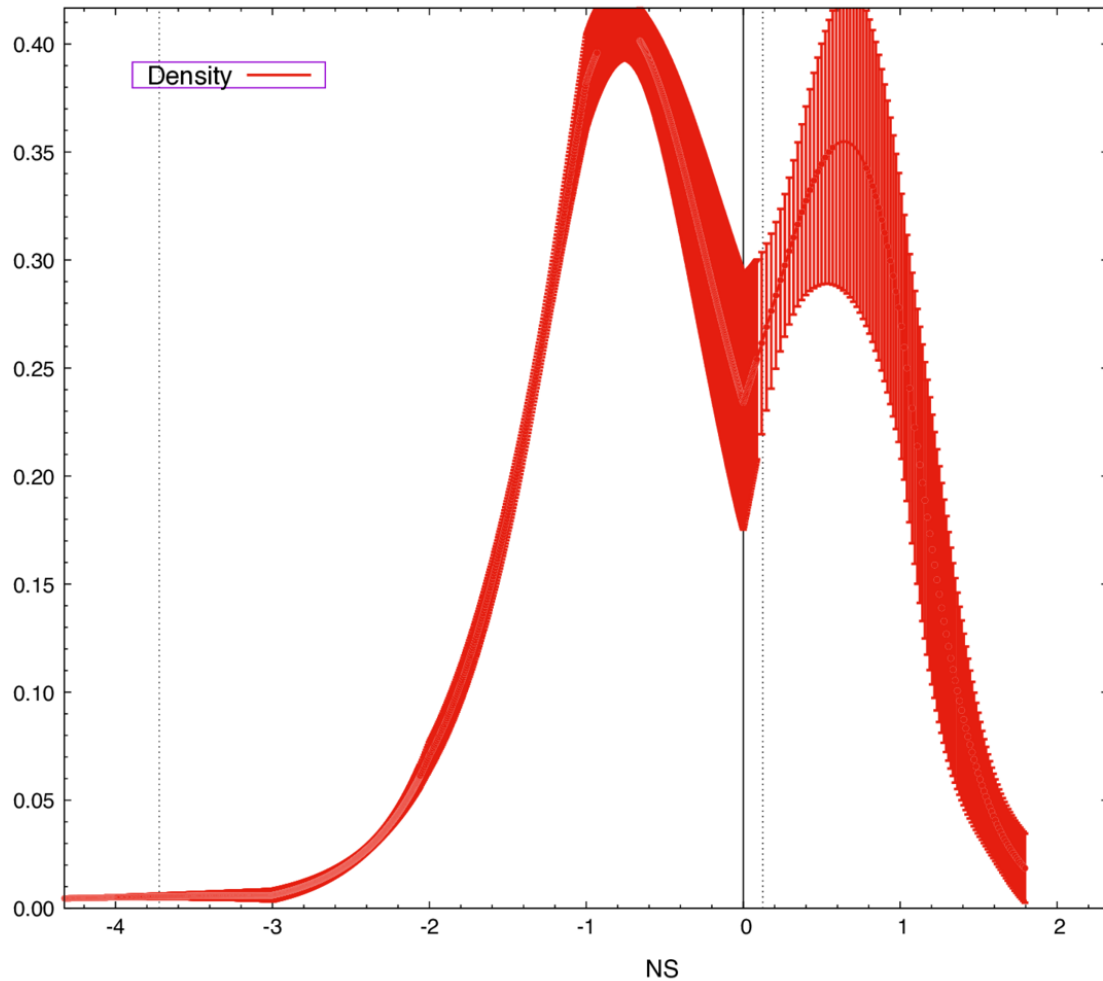
Implied density of 1st Term

K-space

It could double or half again...

But (almost) no data on call side!?

Density T = 20210129



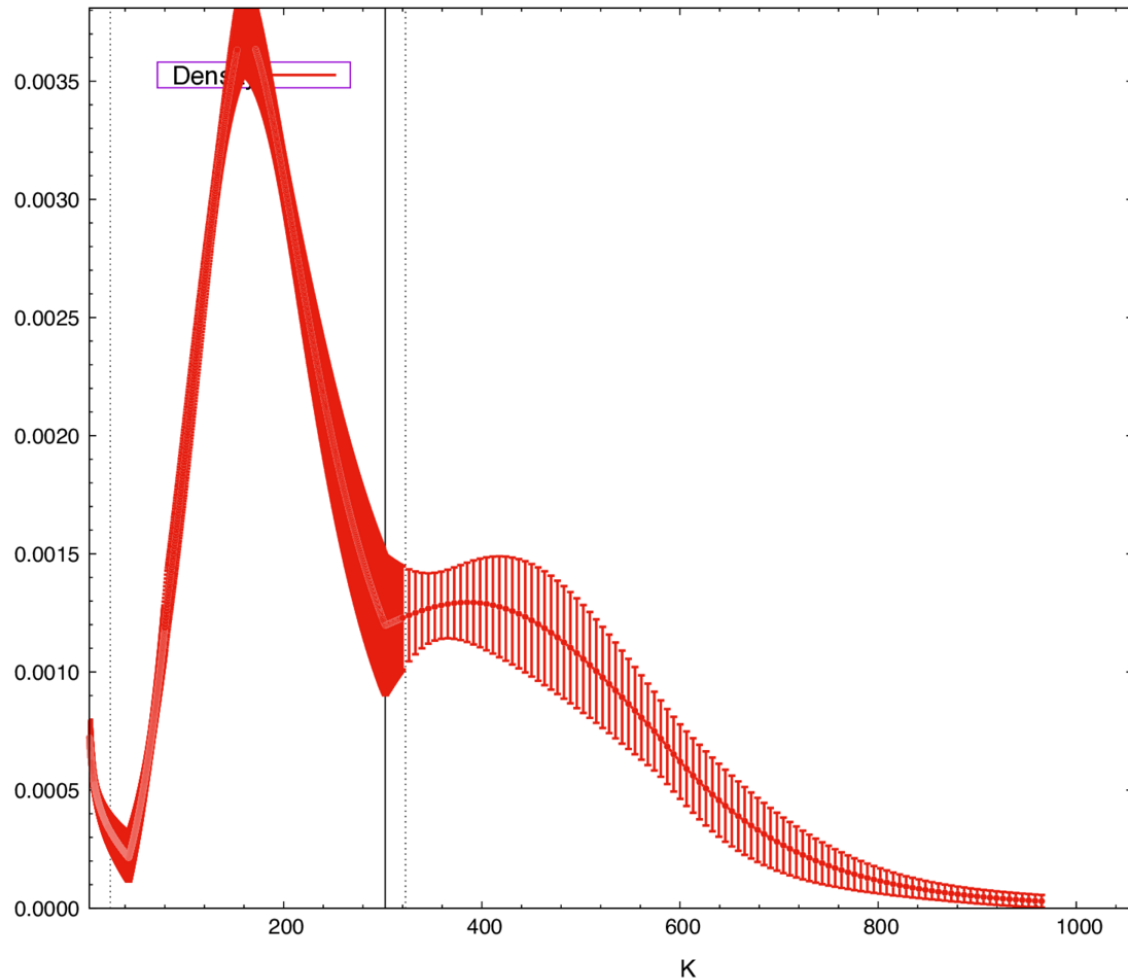
Gamestop 2021-01-27

The day it more than doubled...

Implied density of 1st Term
With error bars!

NS-space

Density T = 20210129



Gamestop 2021-01-27

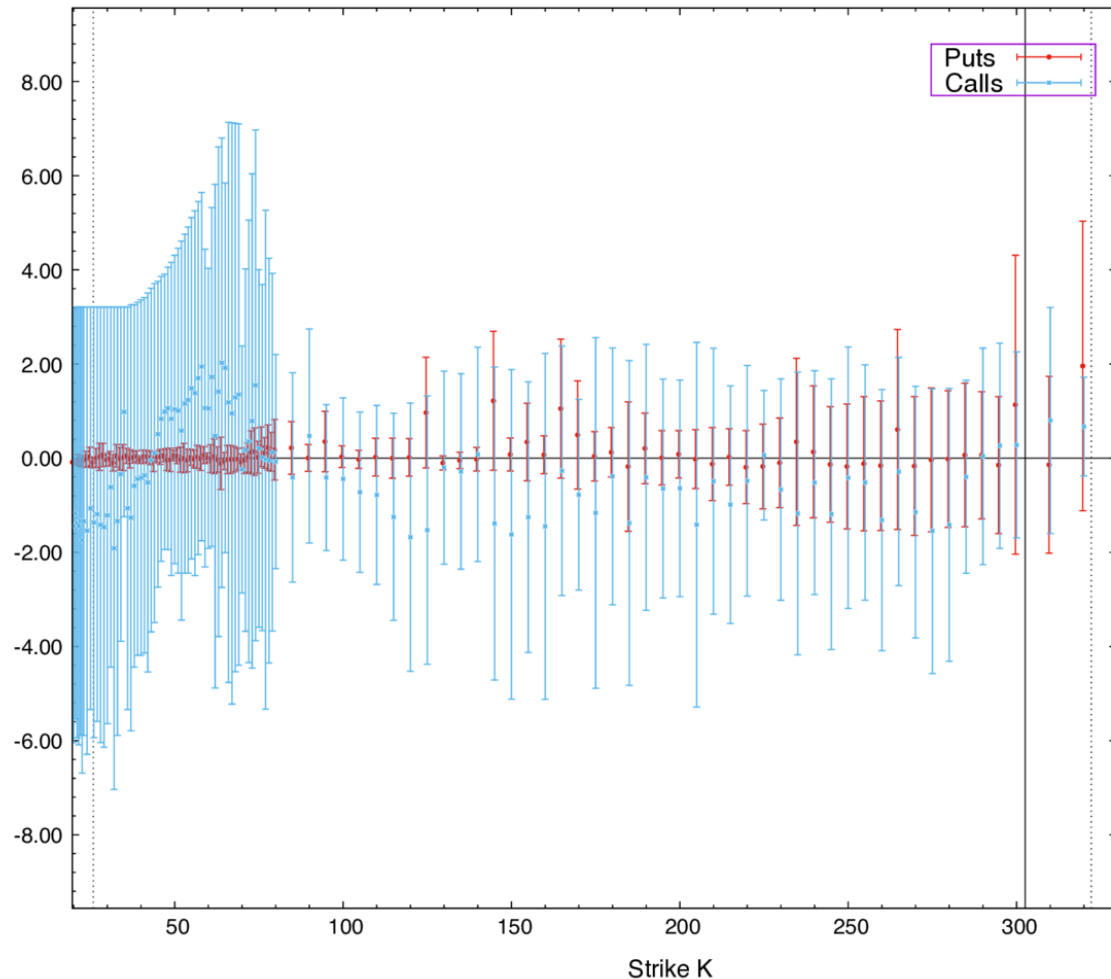
The day it more than doubled...

Implied density of 1st Term
With error bars!

K-space

How large are systematic error bars on call side??

Mkt - Theo T = 20210129



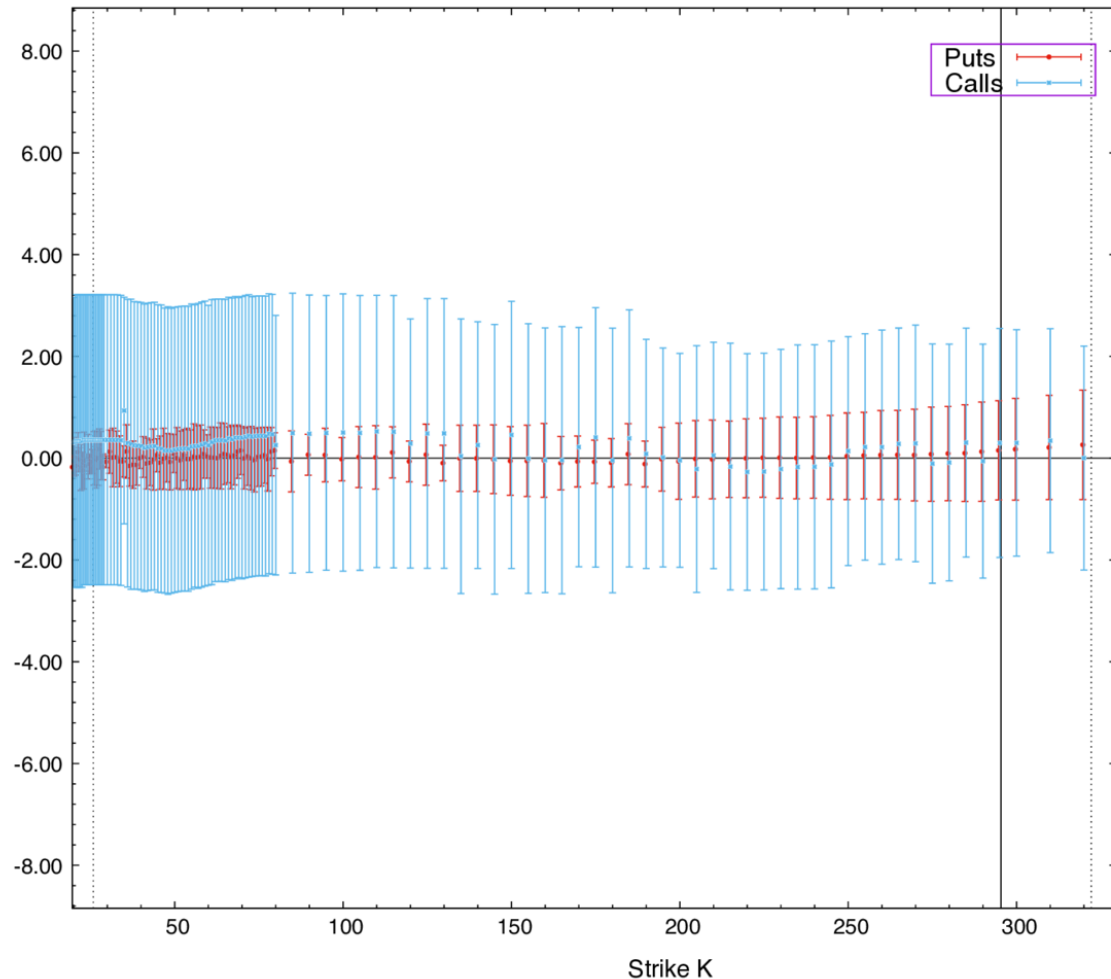
Gamestop 2021-01-27

The day it more than doubled...

Implied vols of 1st Term: **P & C**

PriceDiff plot:
The ultimate truth

Mkt - Theo T = 20210205



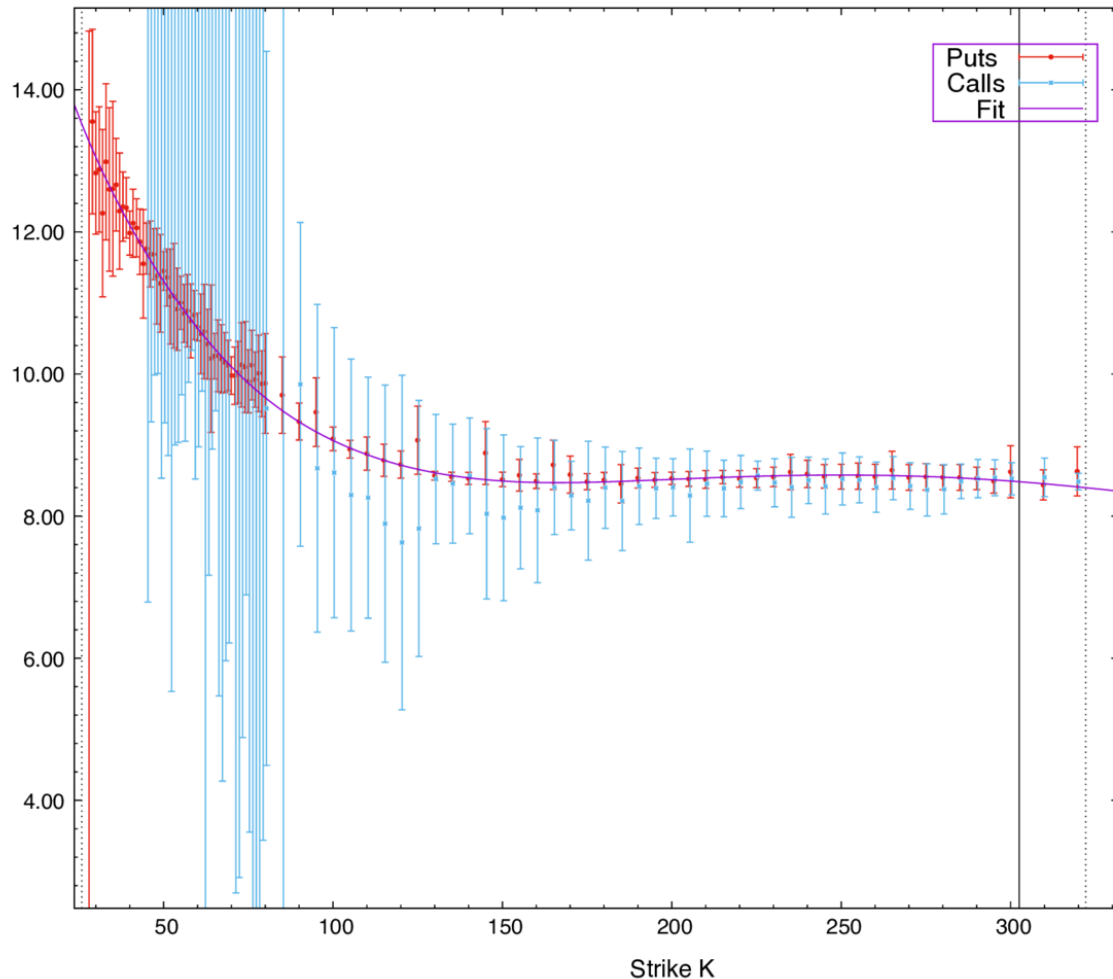
Gamestop 2021-01-27

The day it more than doubled...

Implied vols of 2nd Term: **P & C**

PriceDiff plot:
The ultimate truth

Vol T = 20210129

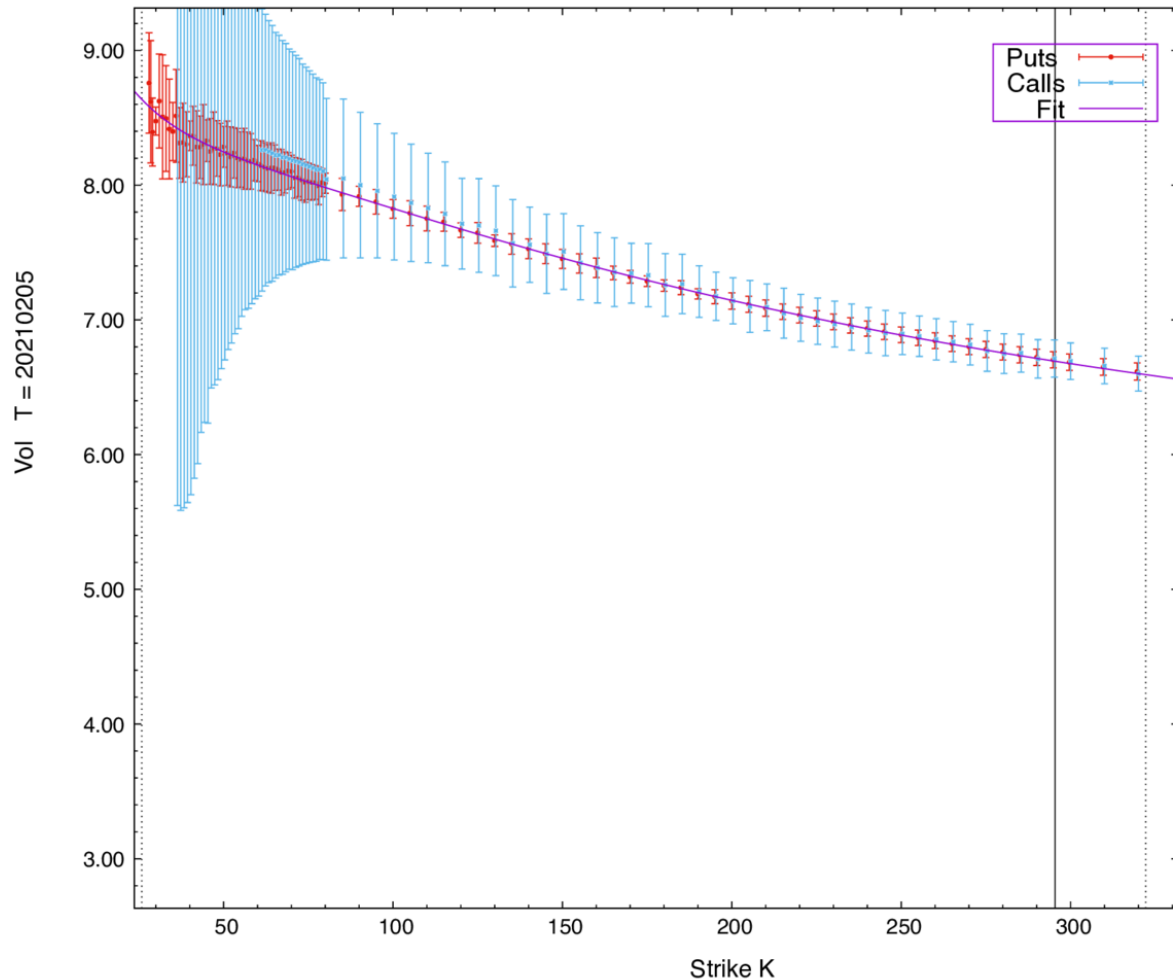


Gamestop 2021-01-27

The day it more than doubled...

Implied vols of 1st Term: **P & C**

American PCP holds



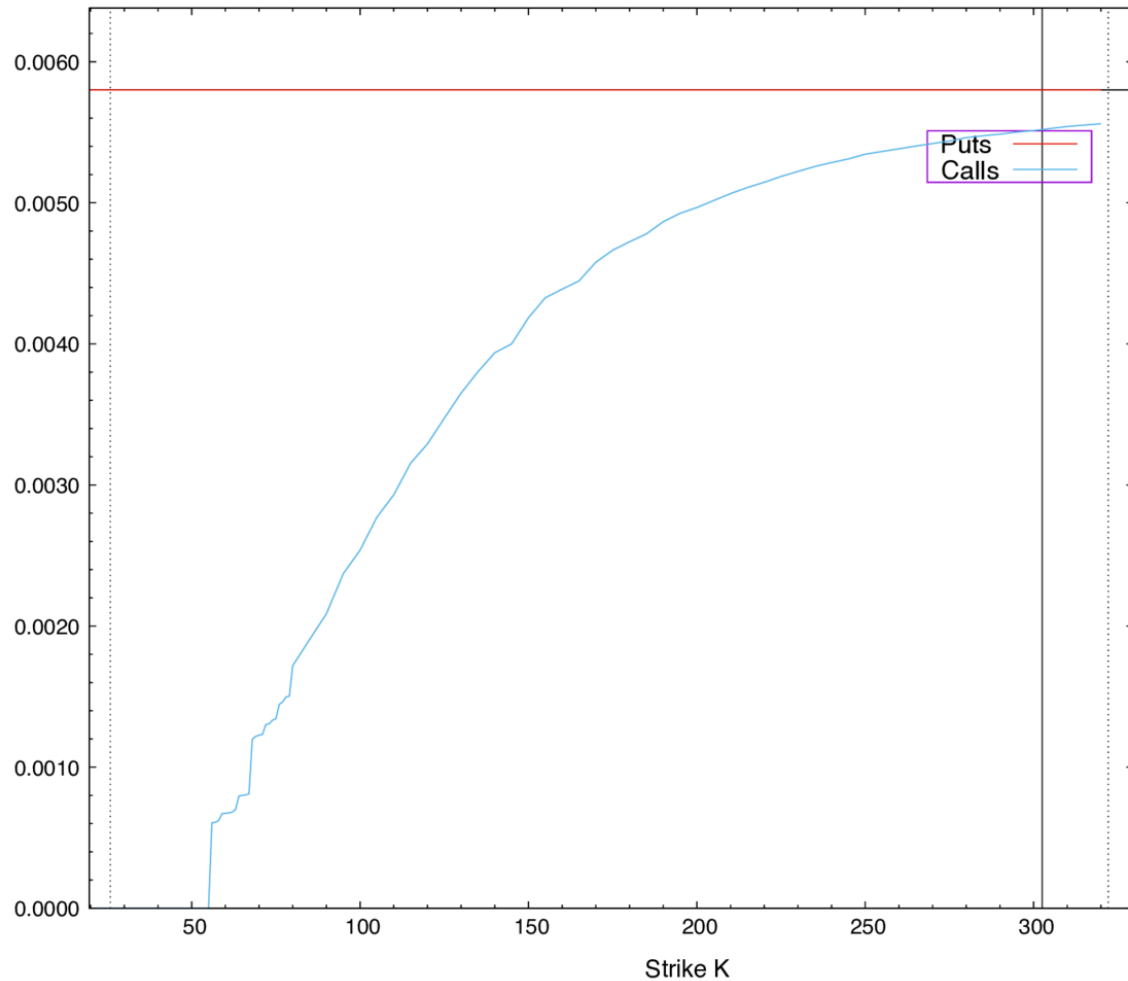
Gamestop 2021-01-27

The day it more than doubled...

Implied vols of 2nd Term: **P & C**

American PCP holds

Fugit T = 20210129

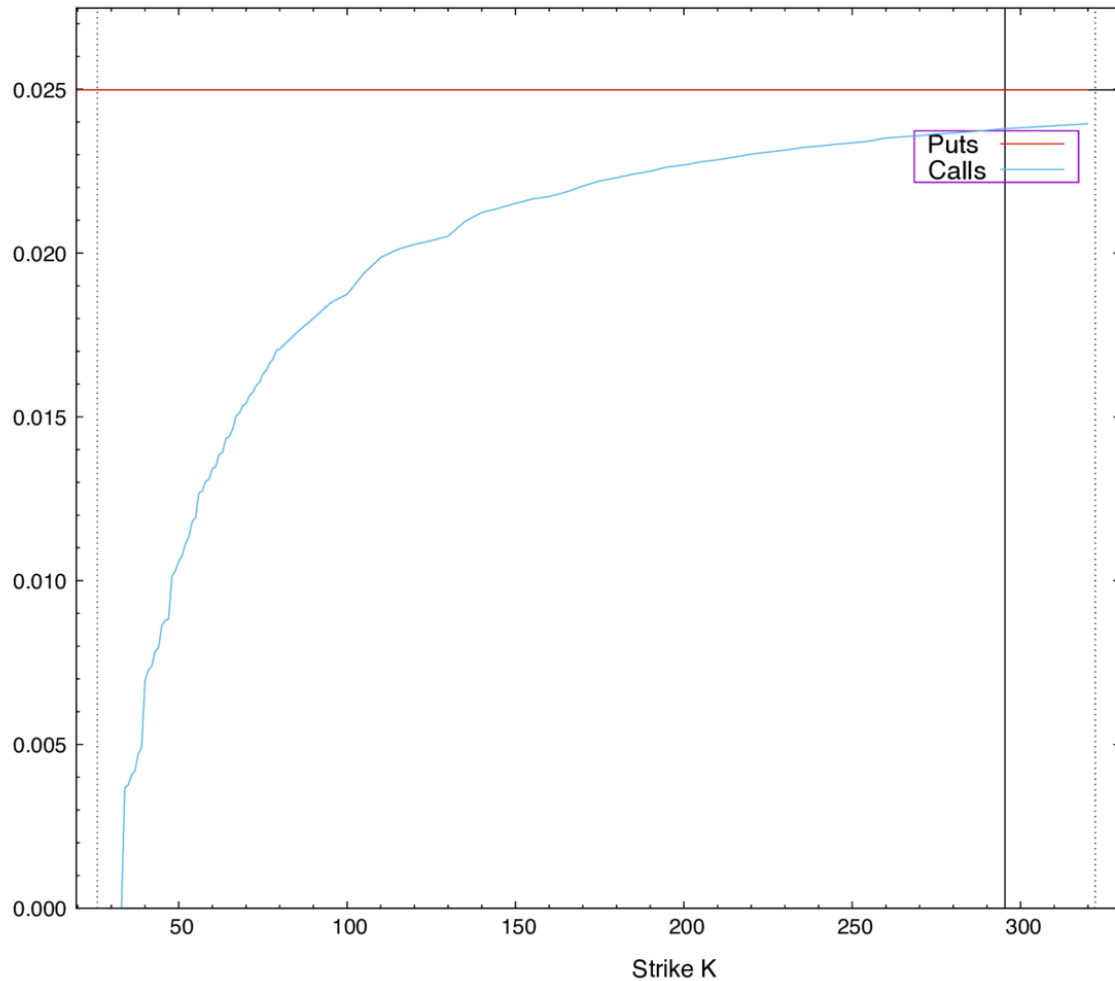


Gamestop 2021-01-27

The day it more than doubled...

Fugit of 1st Term

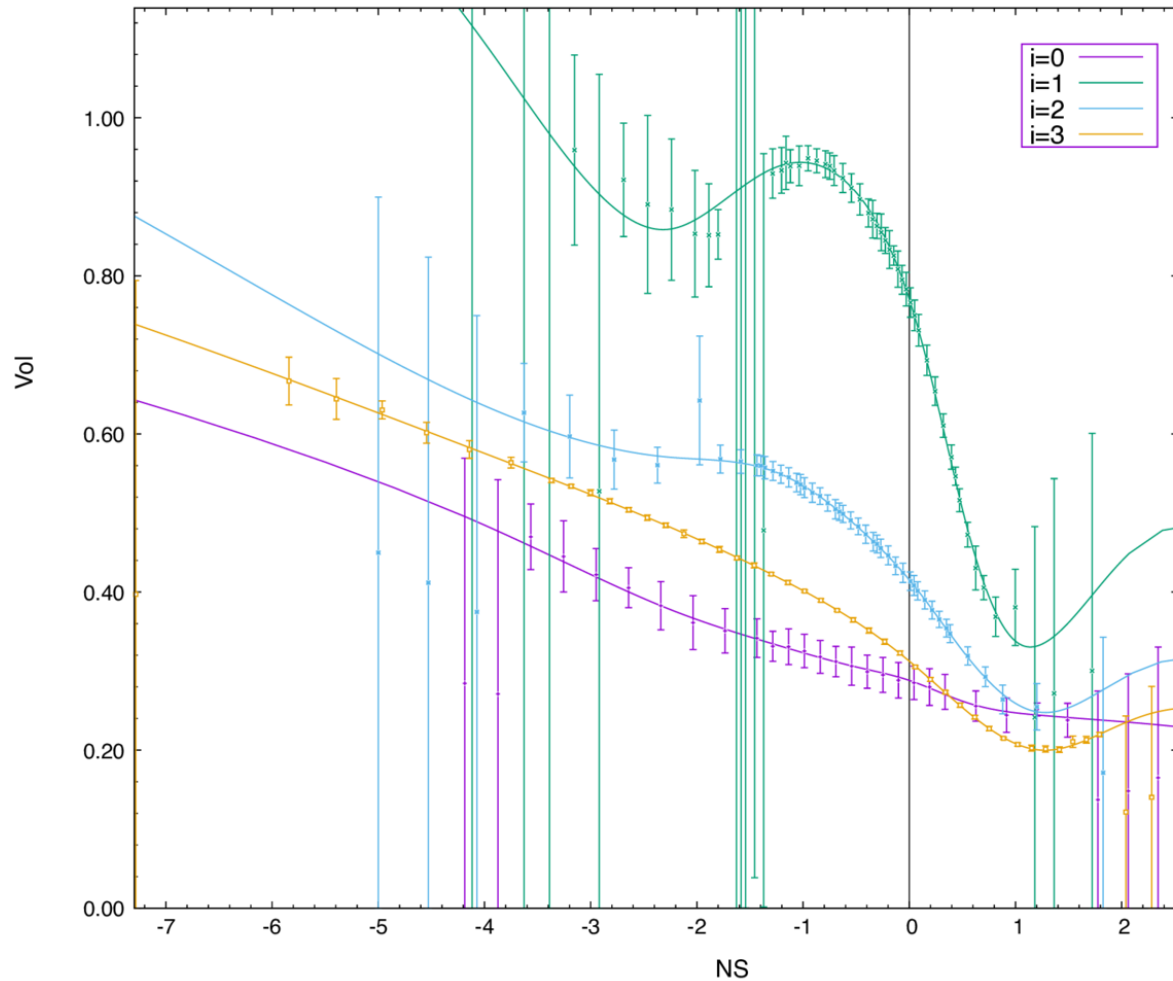
Fugit $T = 20210205$



Gamestop 2021-01-27

The day it more than doubled...

Fugit of 2nd Term

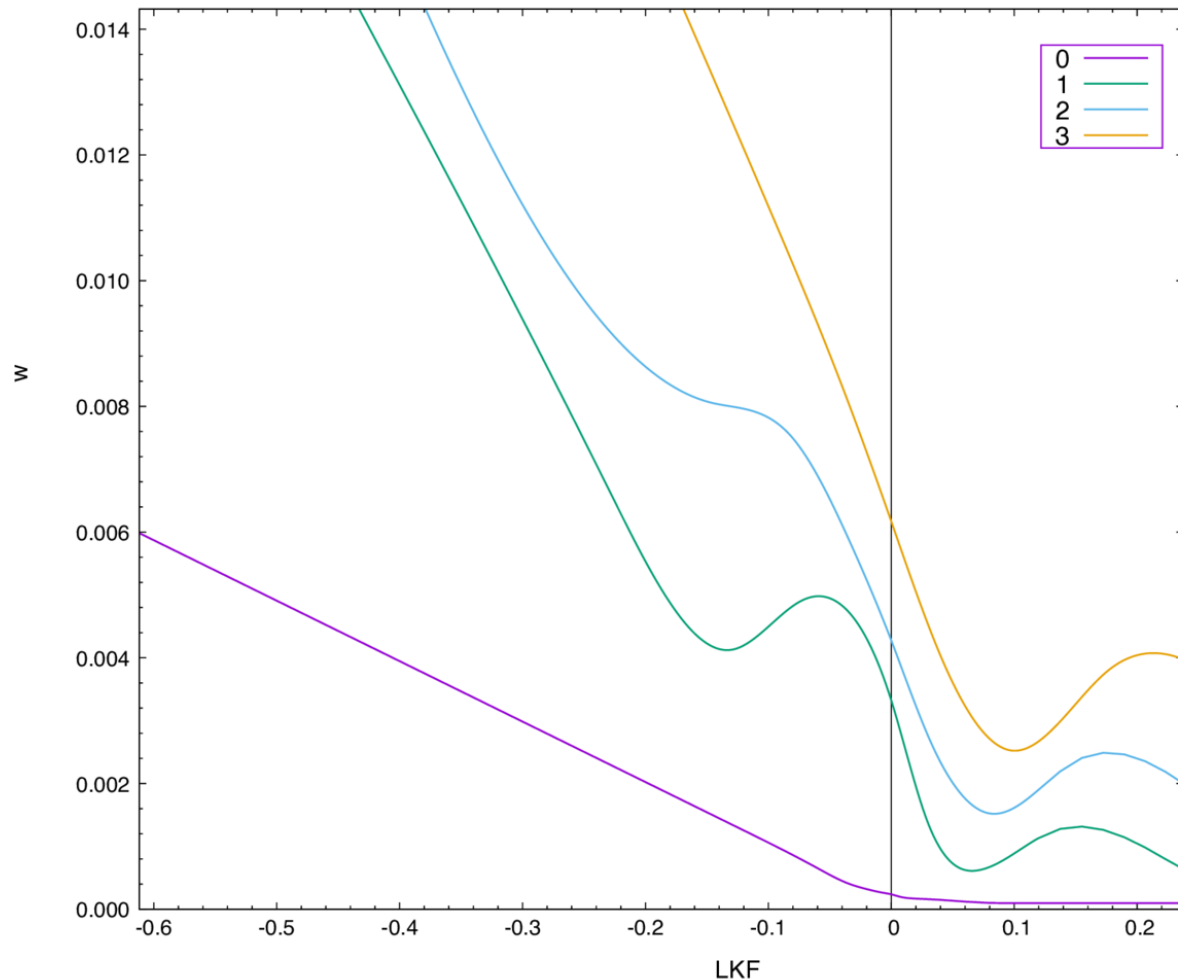


AEX 2016-06-22

Day before **Brexit!**

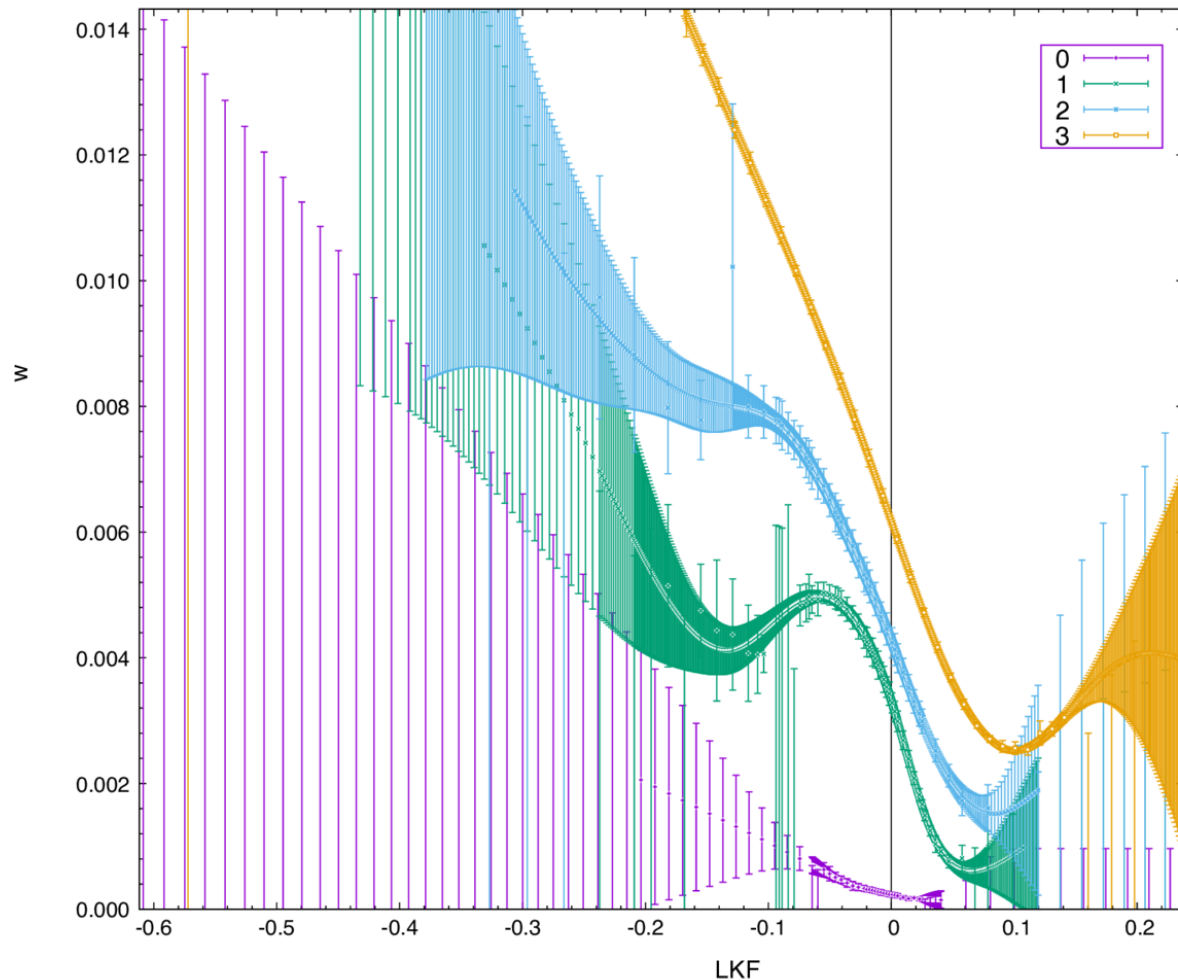
Vol vs NS

$$z := \text{NS} := \frac{\ln(K/F)}{\sigma_0 \sqrt{T}}$$



Fitting **AEX** on day
before **Brexit**

Total Var plot

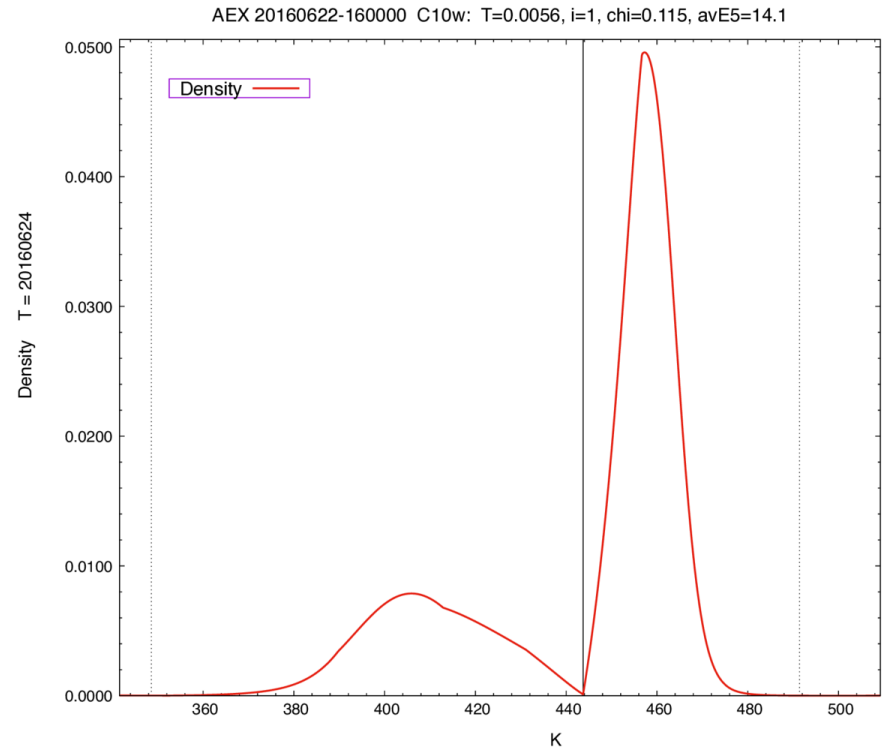
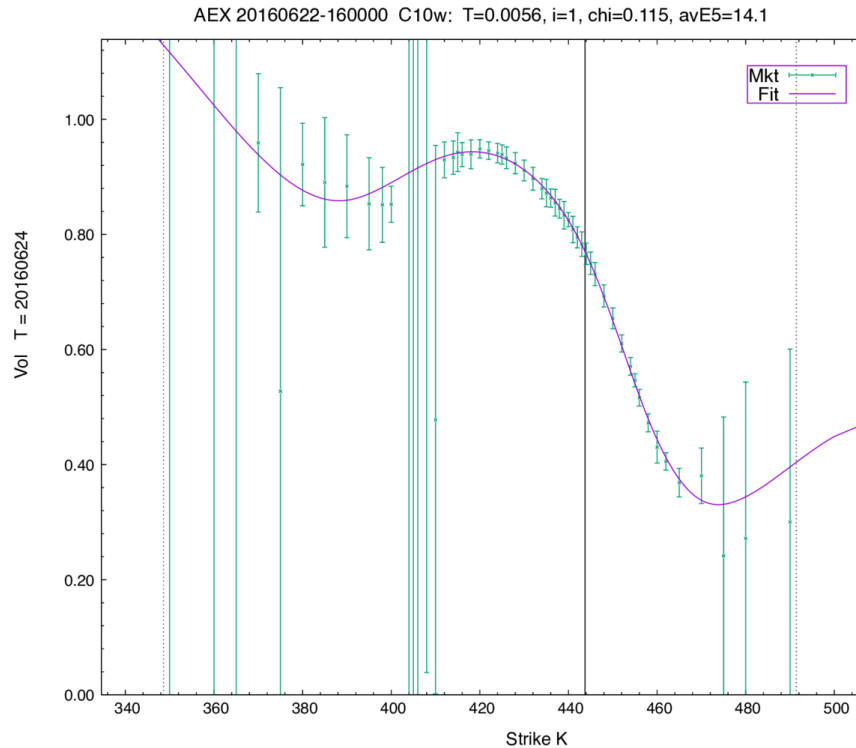


Fitting **AEX** on day
before **Brexit**

Total Var plot
with error bars

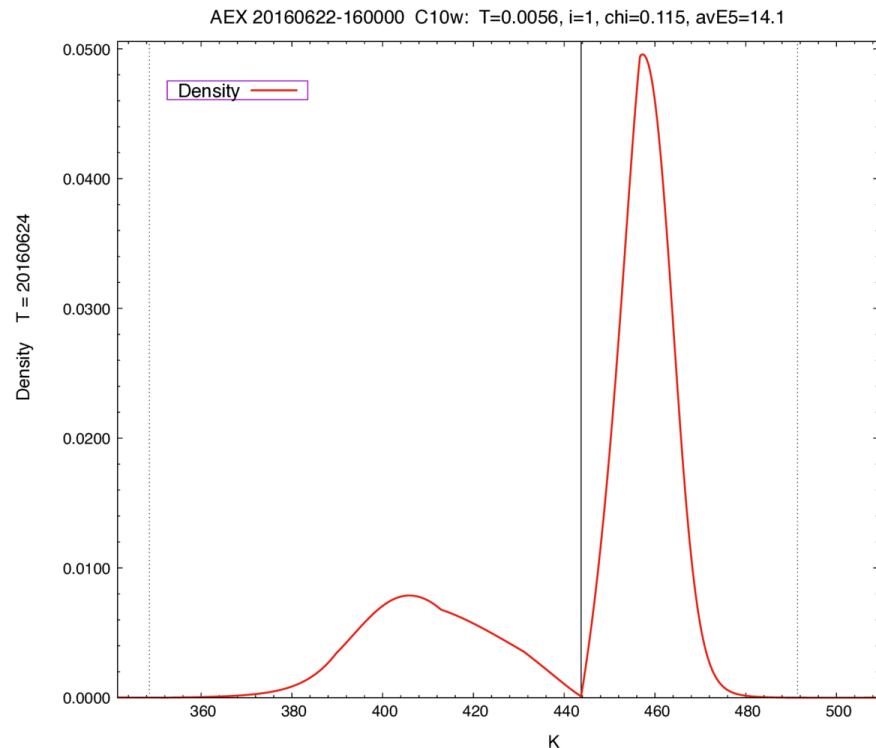
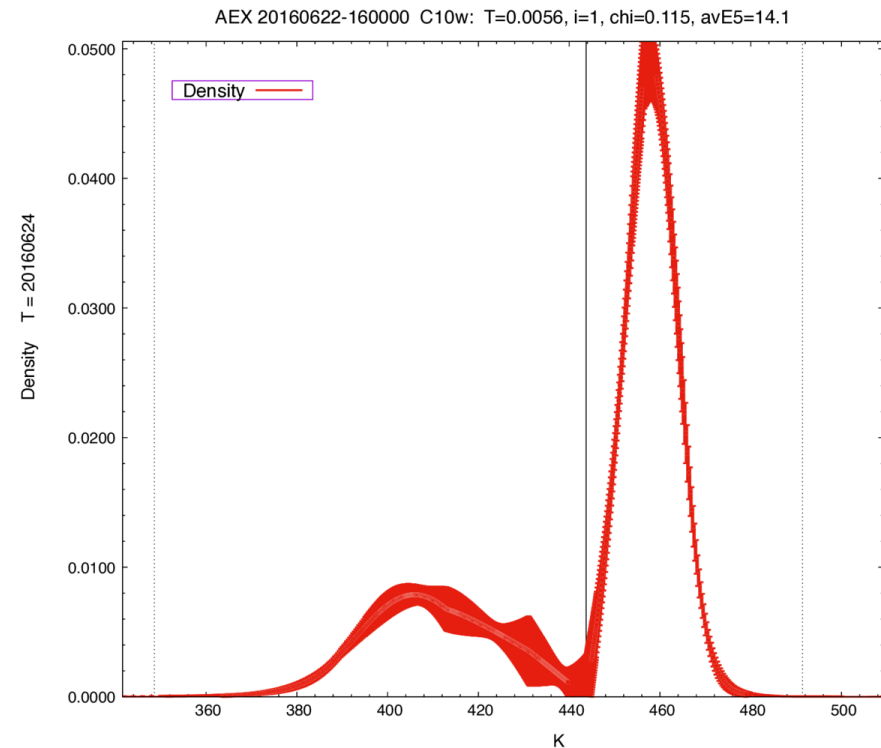
AEX on day before **Brexit** vote:

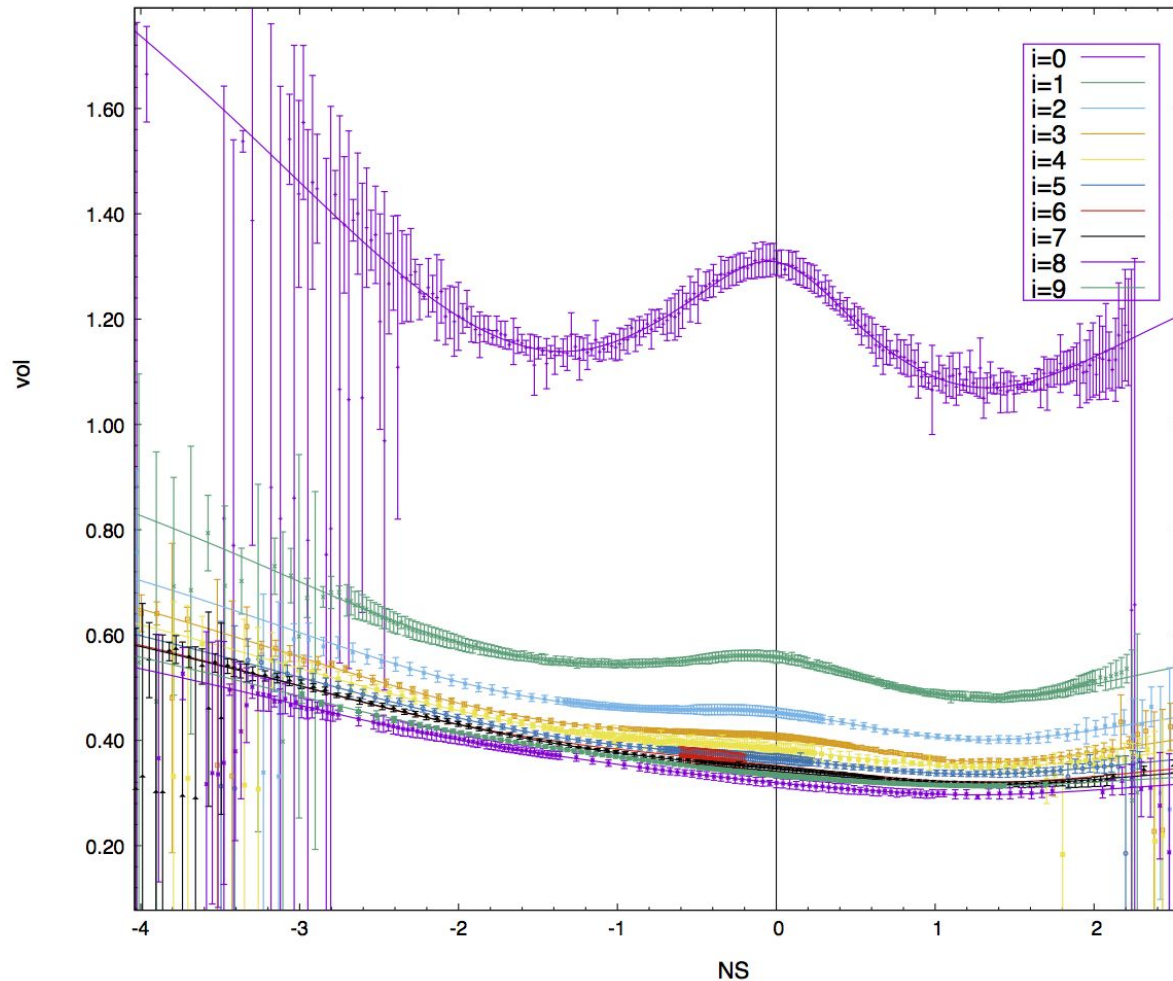
T=2d, vols and implied density



AEX on day before **Brexit** vote:

T=2d, implied density with error bars (**AEX** dropped 5.9%)





AMZN 2018-04-26
earnings day

C8 Vol vs NS

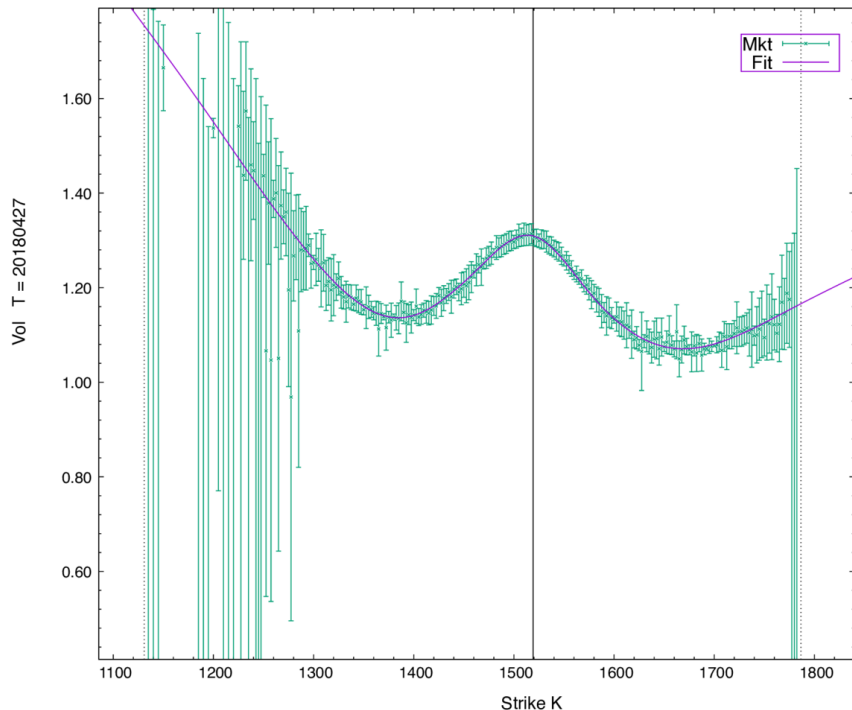
Interesting Thursday: Earnings, new weekly listed, etc.

$$z := NS := \frac{\ln(K/F)}{\sigma_0 \sqrt{T}}$$

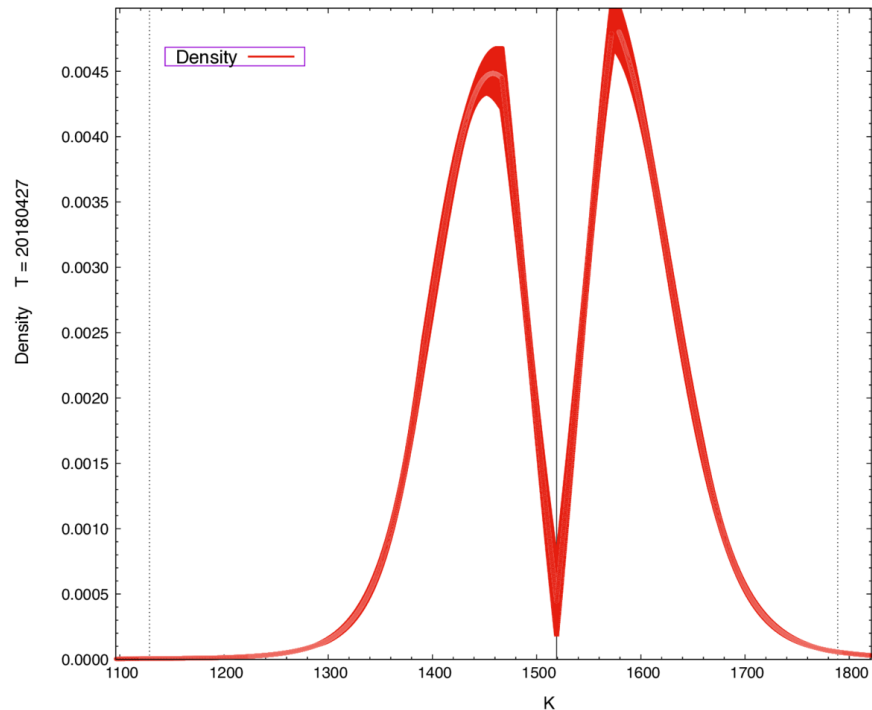
AMZN 2018-04-26 earnings day:

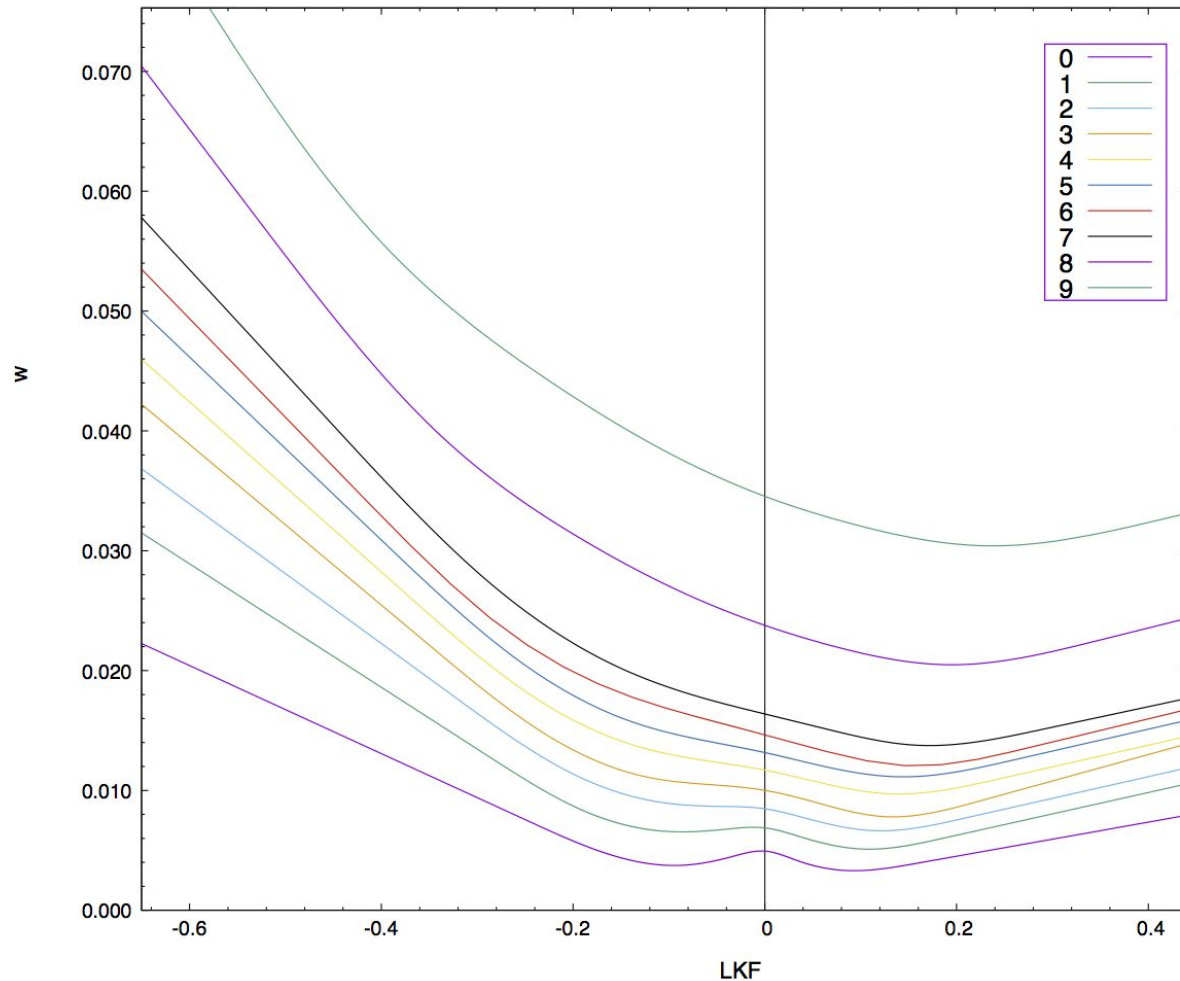
T=1d, vols and implied density — most bimodal density ever!

AMZN 20180426-154500 C8: T=0.0029, i=0, chi=0.112, avE5=19.4



AMZN 20180426-154500 C8: T=0.0029, i=0, chi=0.112, avE5=19.4





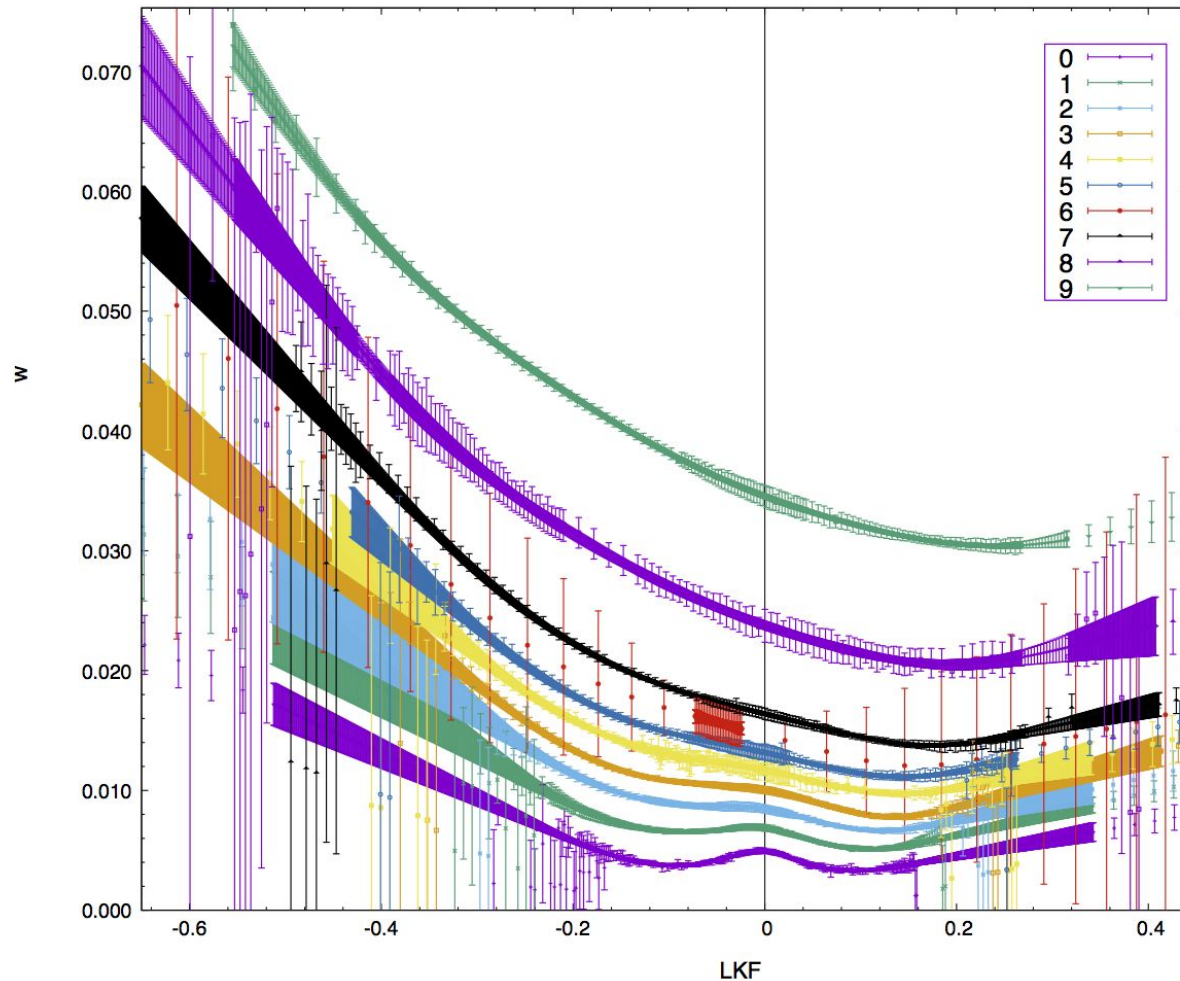
AMZN 2018-04-26
earnings day

C8 **total variance** plot

First 10 terms

No calendar arbitrage! (Or butterfly...)

Interesting Thursday: Earnings, new weekly listed (**i=6**), etc.

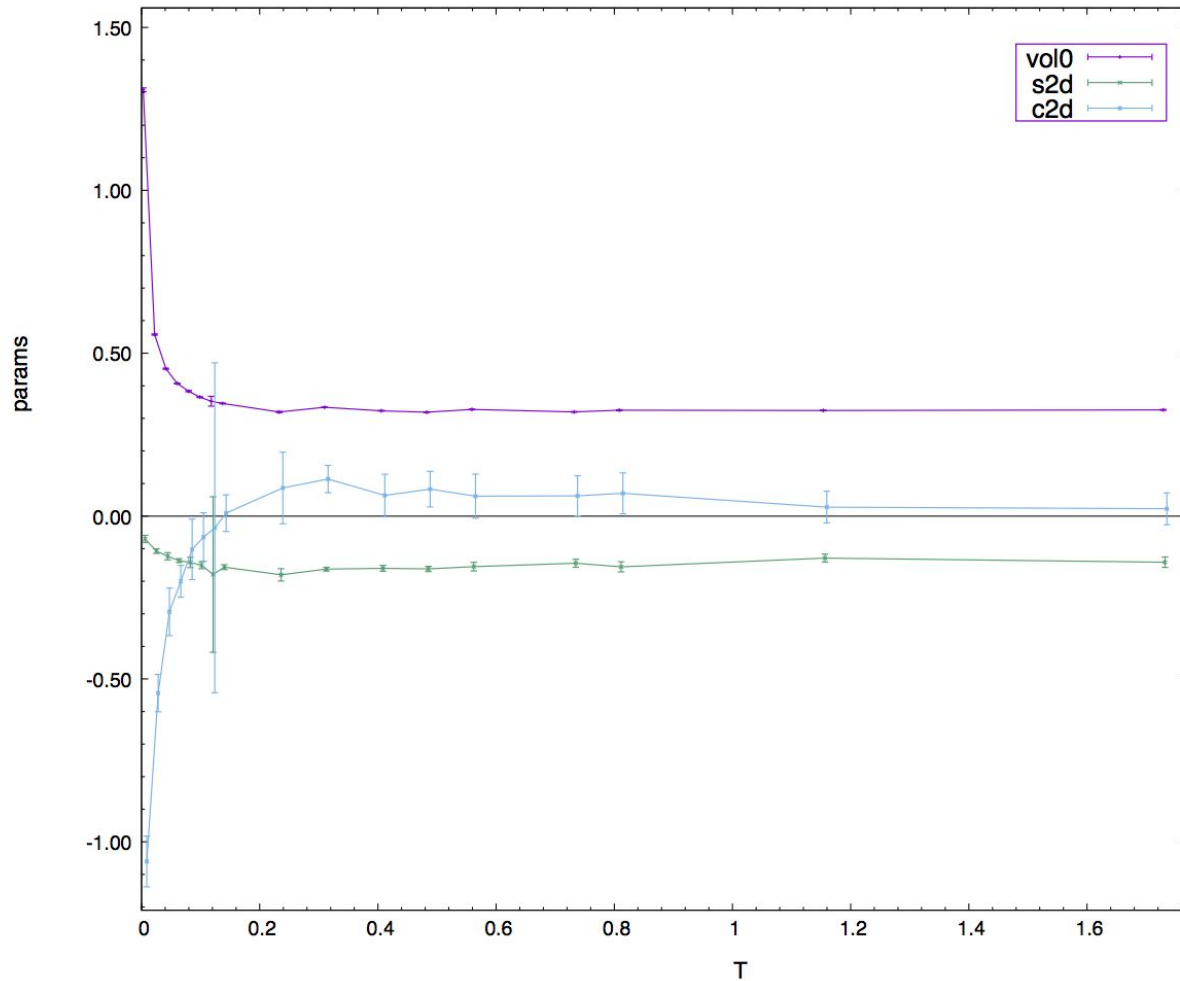


AMZN 2018-04-26
earnings day

C8 **total variance** plot

First 10 terms, with **errors bars**

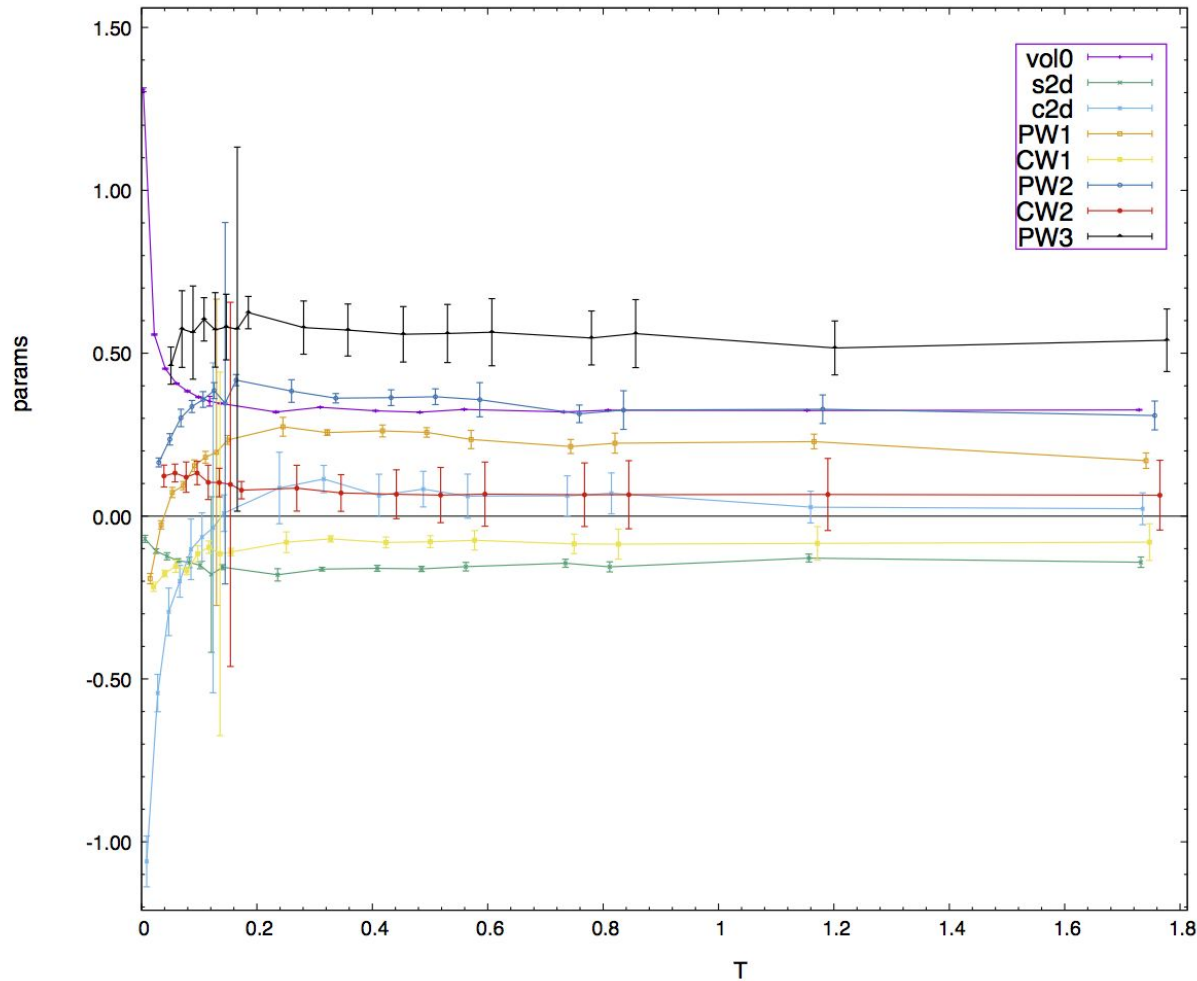
Interesting Thursday: Earnings, new weekly
listed (**i=6**), etc.



AMZN 2018-04-26
earnings day

C8 parameter term-structure
First 3: vol0, s2, c2

Essentially flat shape params after 3m



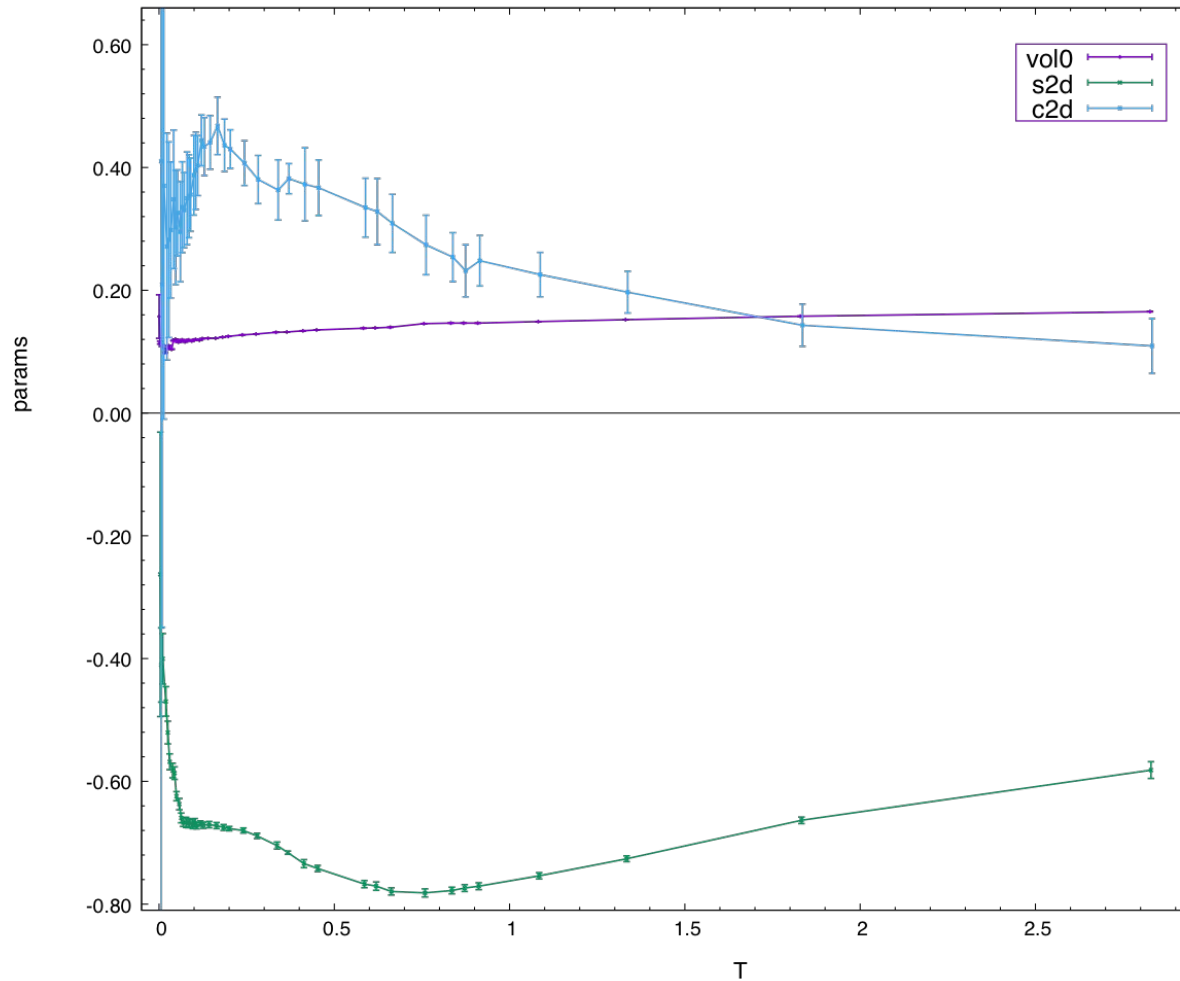
AMZN 2018-04-26
earnings day

C8 parameter term-structure

Essentially flat shape params after 3m

SPX during the covid crash of March 2020

- SPX vol curves and surfaces had unprecedented shapes.
- Supposedly even some Tier 1 bank(s) didn't manage to produce a tradable SPX surface for 2 days (e.g. arbitrage-free).
- But the options market functioned perfectly fine at all times and those “funky” shapes reflected quite precise & consistent forward-looking views.



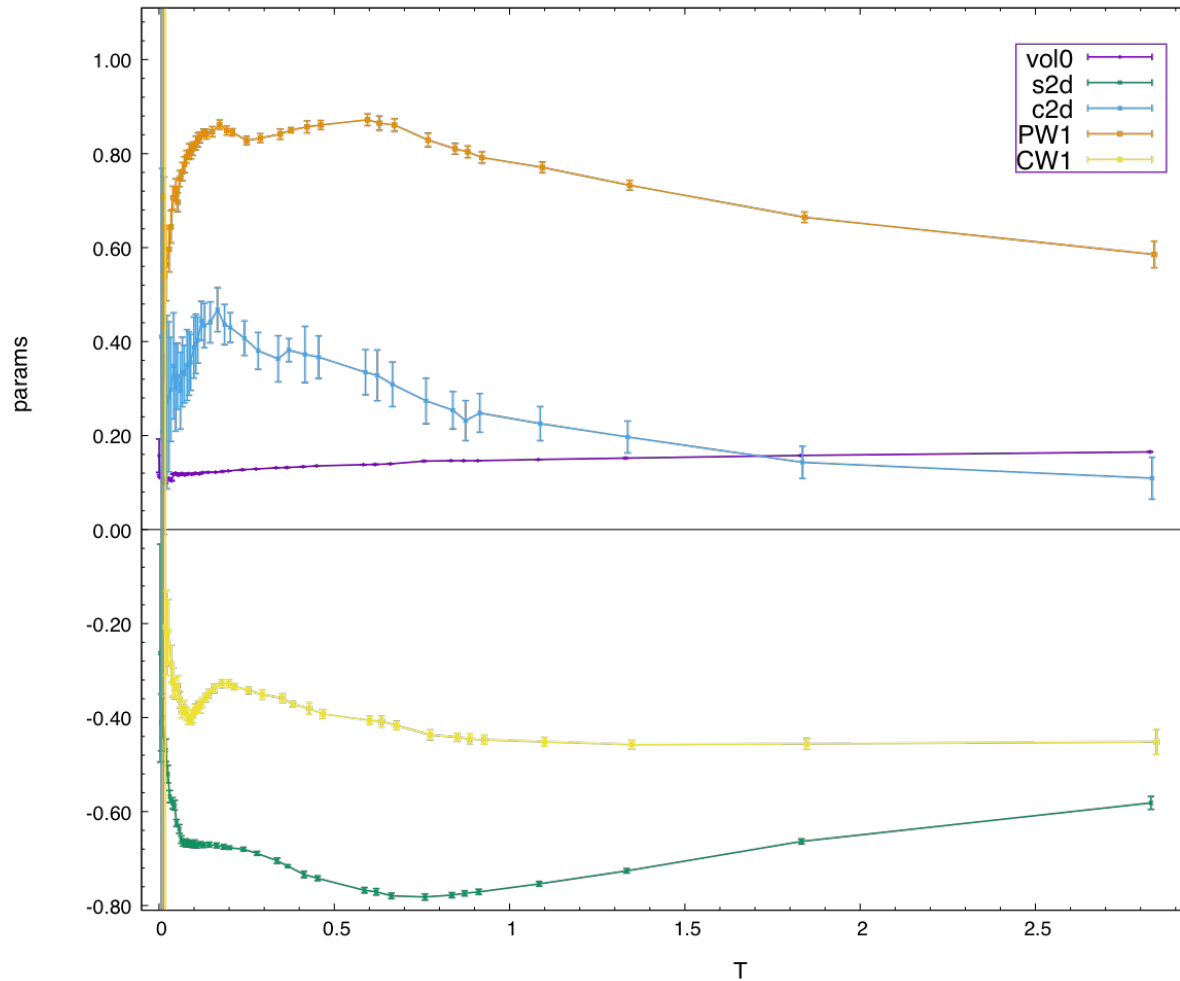
**For reference: 3w before
big covid crash...**

SPX 20200218 15:00

C15PM Param Term-Structure

First 3 params...

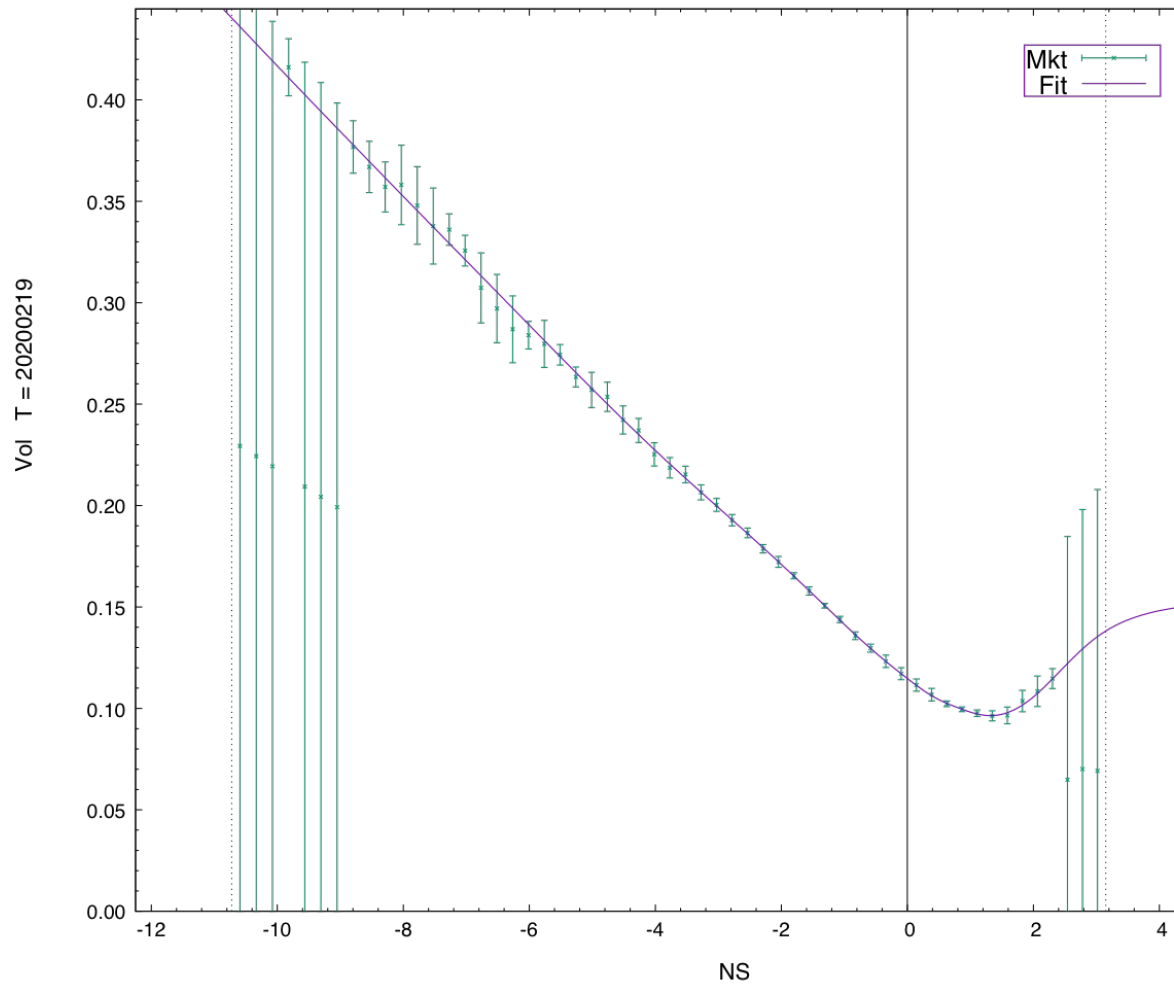
s2(T) a bit unusual...



SPX 20200218 15:00

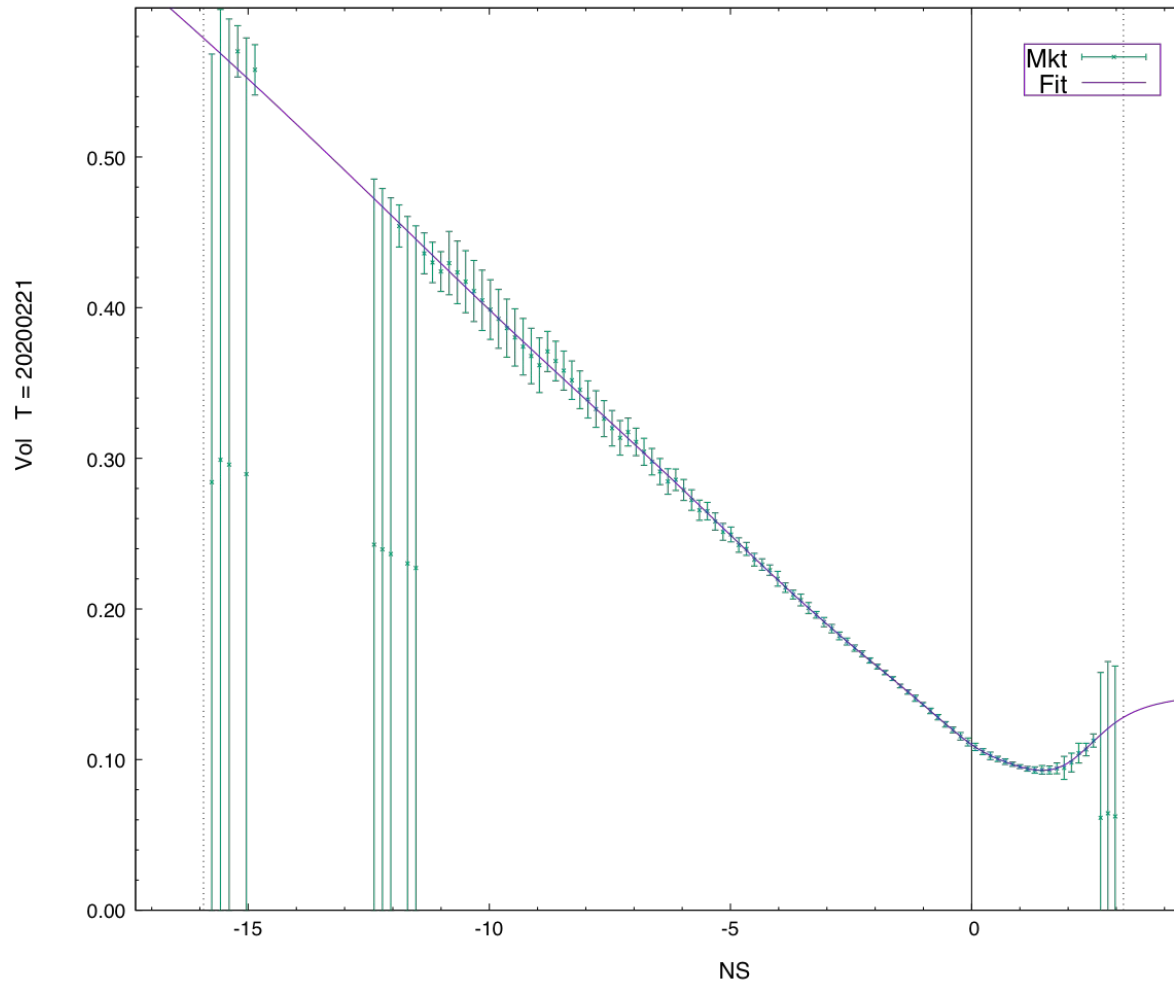
C15PM Param Term-Structure

First 5 params... meaning?



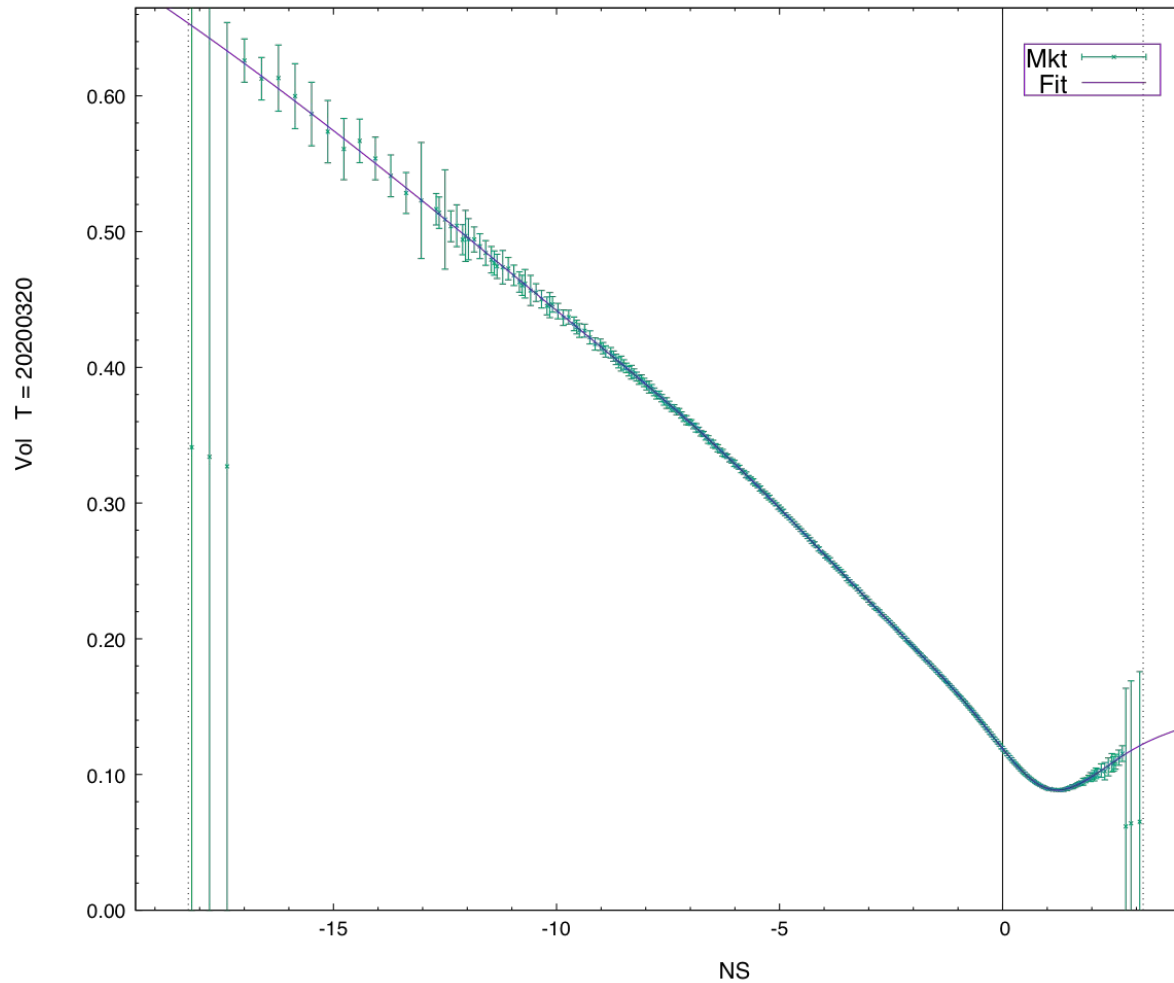
SPX 20200218 15:00

C15PM T = 1d



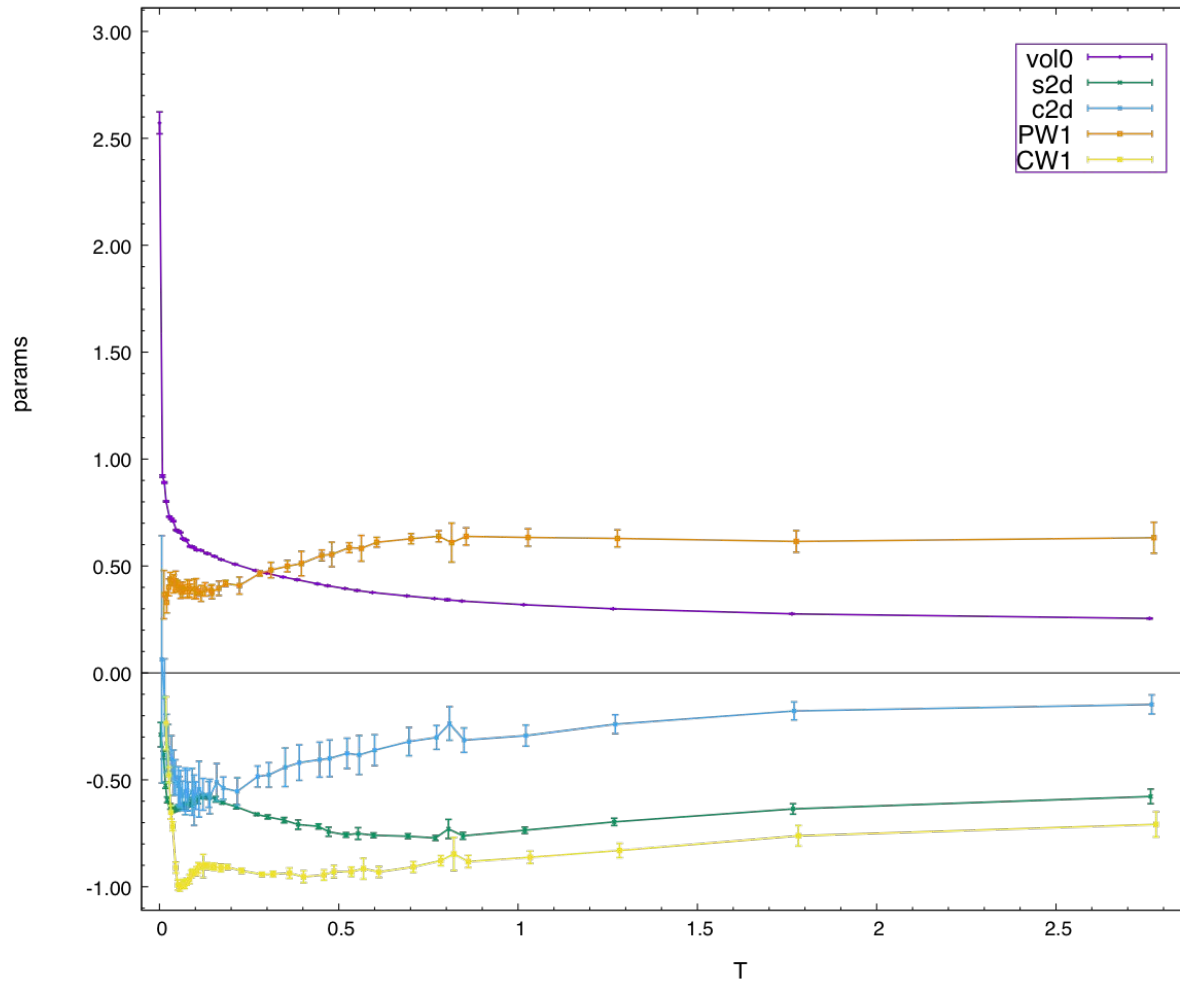
SPX 20200218 15:00

C15PM T = 3d



SPX 20200218 15:00

C15PM T = 1m



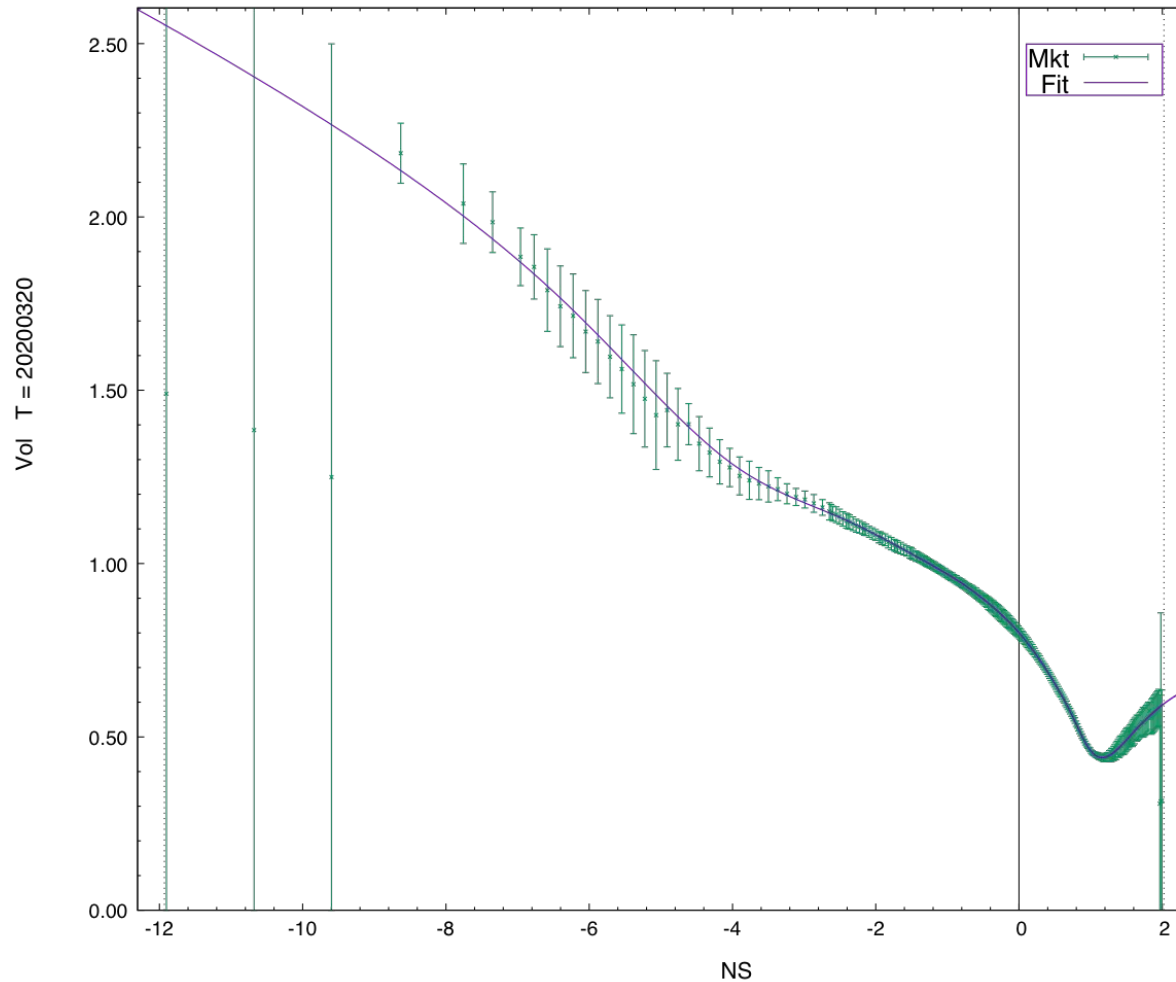
SPX 20200313 15:00

C15K Param Term-Structure
during the **covid crash**

First 5 params...

All **c2** < 0 !!

Super-steep near call wing: **CW1**

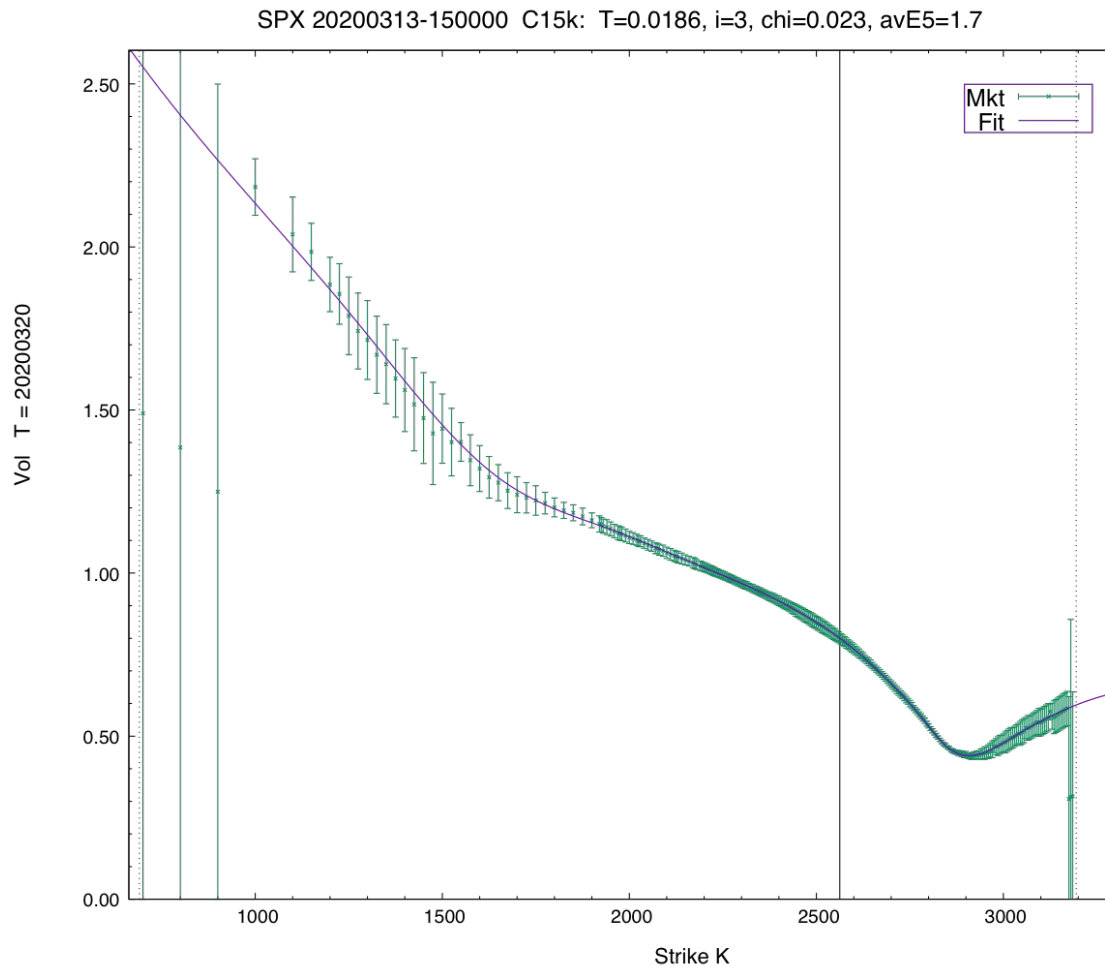


SPX 20200313 15:00

C15K T = 1w, in NS-space

Very compressed CW.

If fit followed PW more closely there would be fly arb...



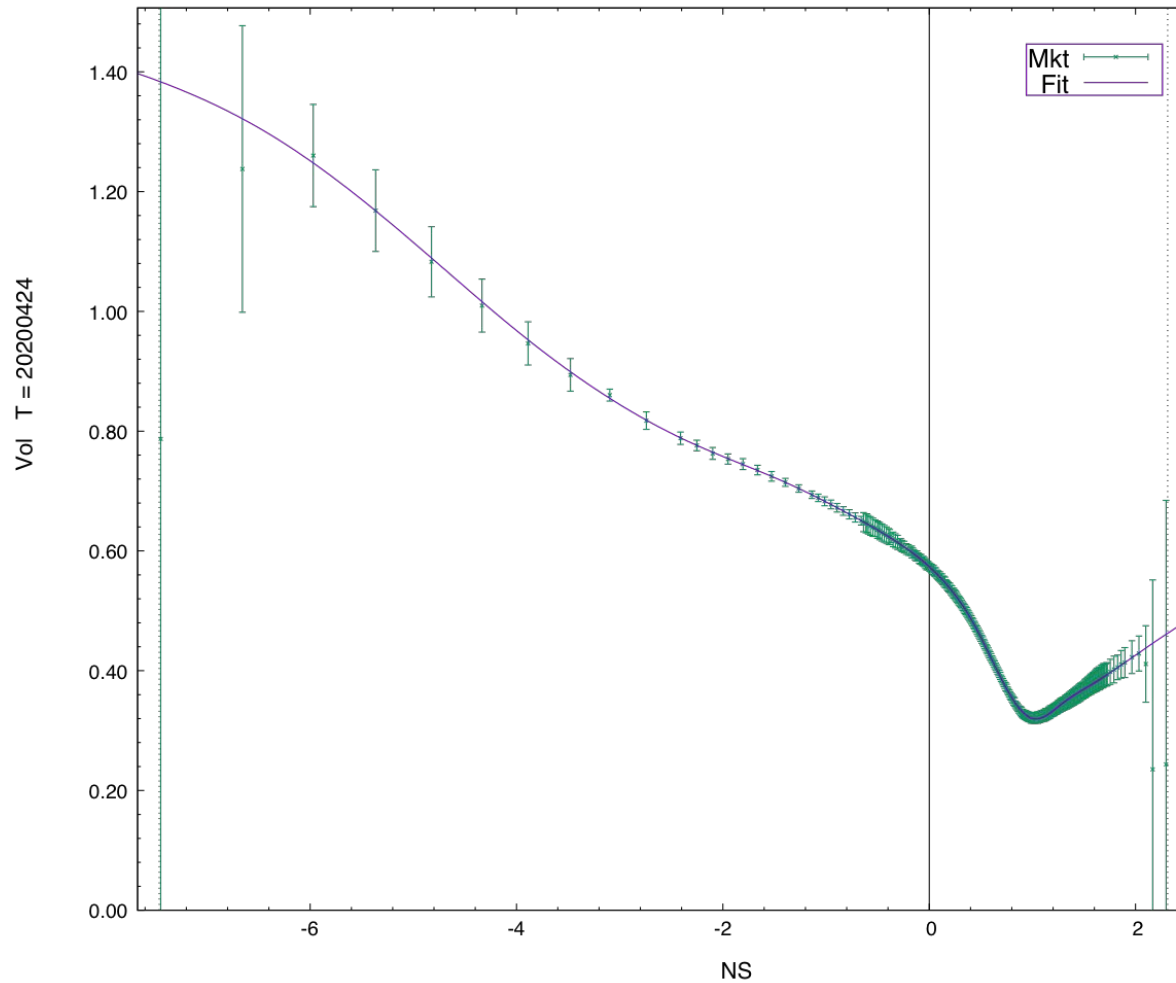
SPX 20200313 15:00

C15K $T = 1w$, in K-space

Very compressed CW.

If fit followed PW more closely there would be fly arb...

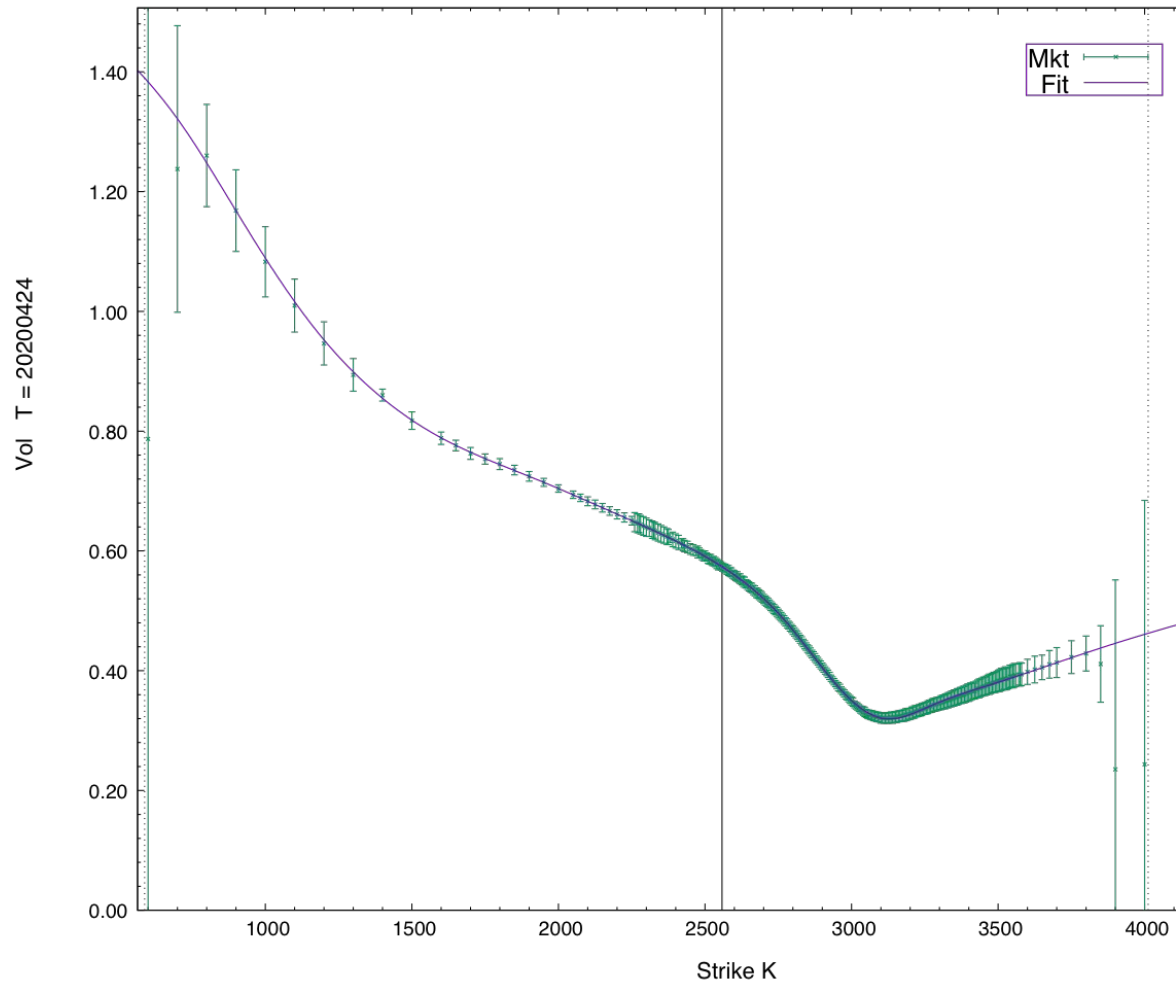
(Pretty well-functioning market over $nK=379$ strikes here...)



SPX 20200313 15:00

C15K T = 6w, in NS-space

Very compressed CW, very sharp knee...



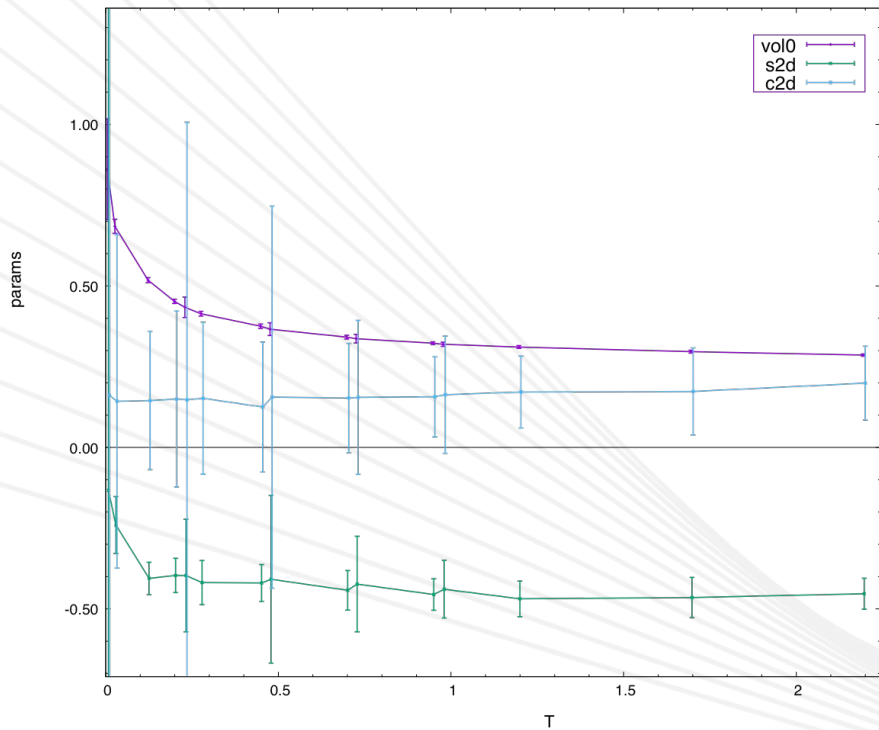
SPX 20200313 15:00

C15K T = 6w, in K-space

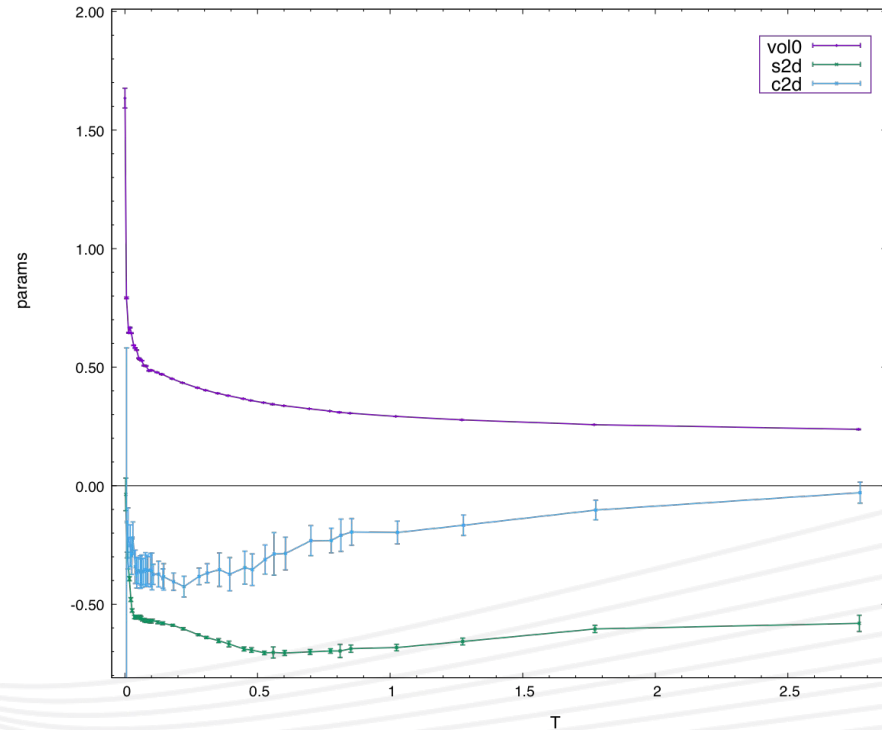
Very compressed CW, very sharp knee...

Parameter TS: 2008 versus 2020

Parameter TS SPX 20081008-160000 C8, $\chi_{\text{Av}}=0.028$

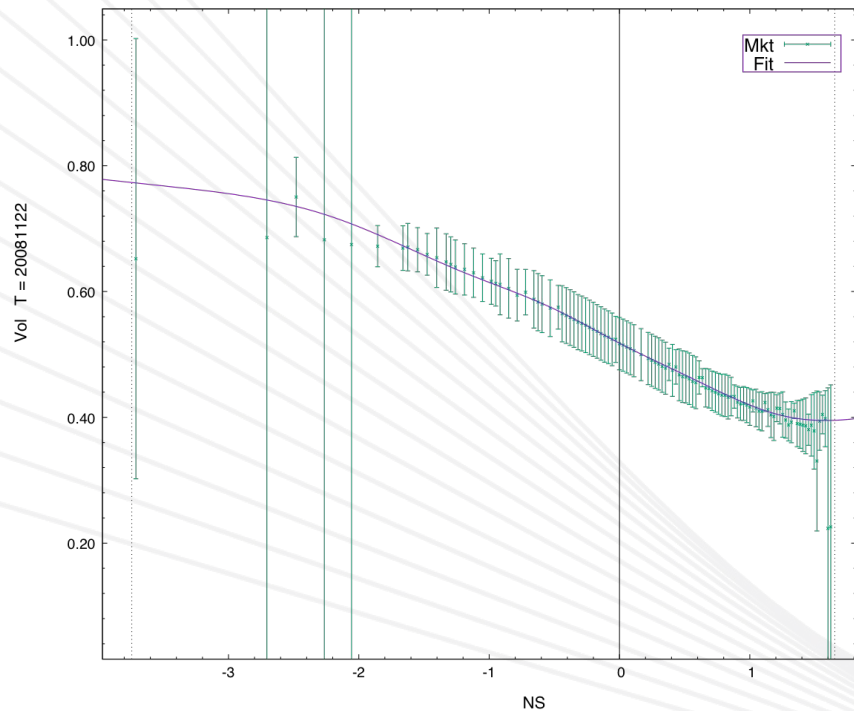


Parameter TS SPX 20200311-150000 C15k, $\chi_{\text{Av}}=0.014$, $F_0=2742.65$

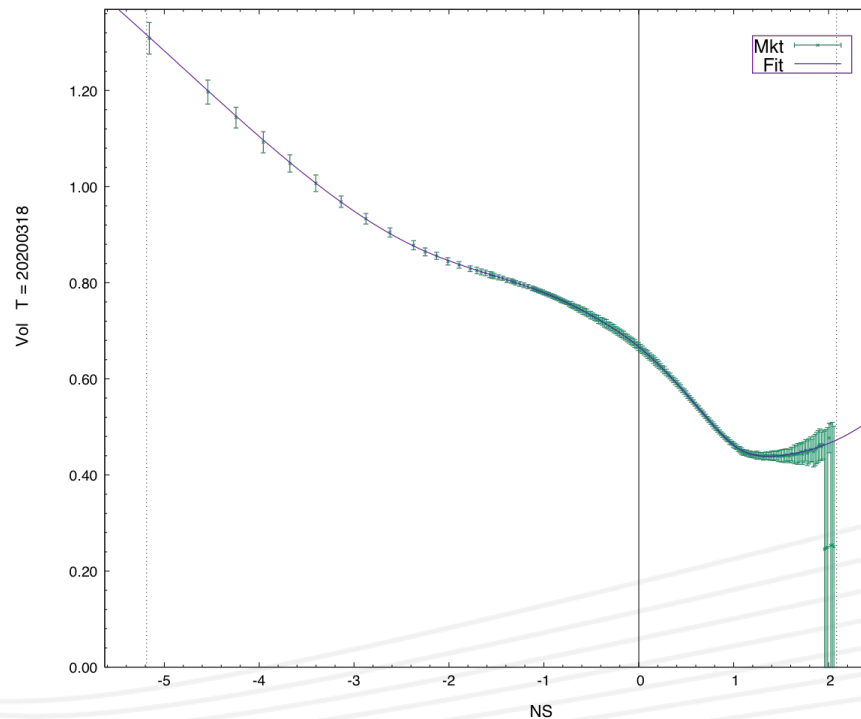


Vol Skews: 2008 versus 2020

SPX 20081008-160000 C8: $T=0.1227$, $i=2$, $\chi=0.027$, $avE5=8.3$

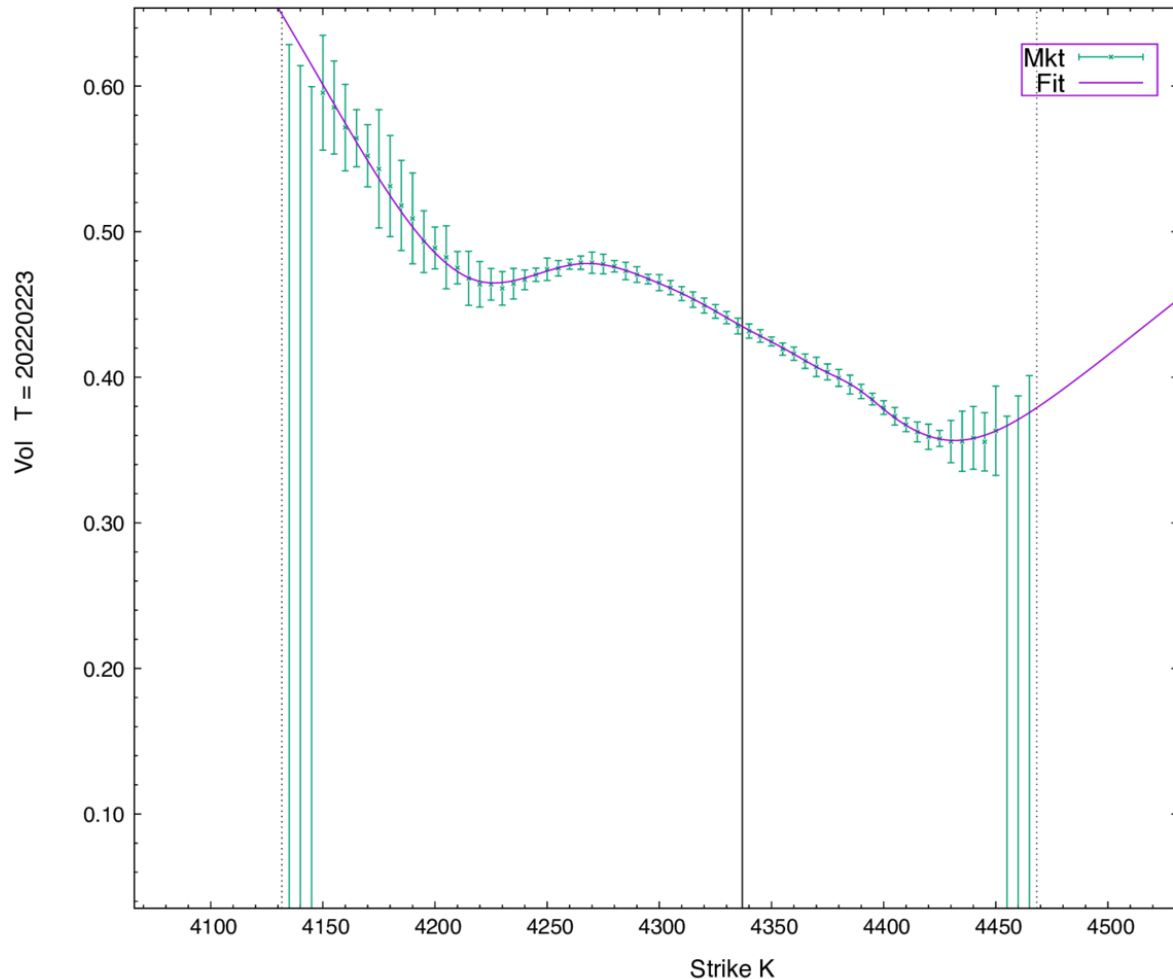


SPX 20200311-150000 C15k: $T=0.0193$, $i=3$, $\chi=0.019$, $avE5=0.7$



Putin's Put Wing

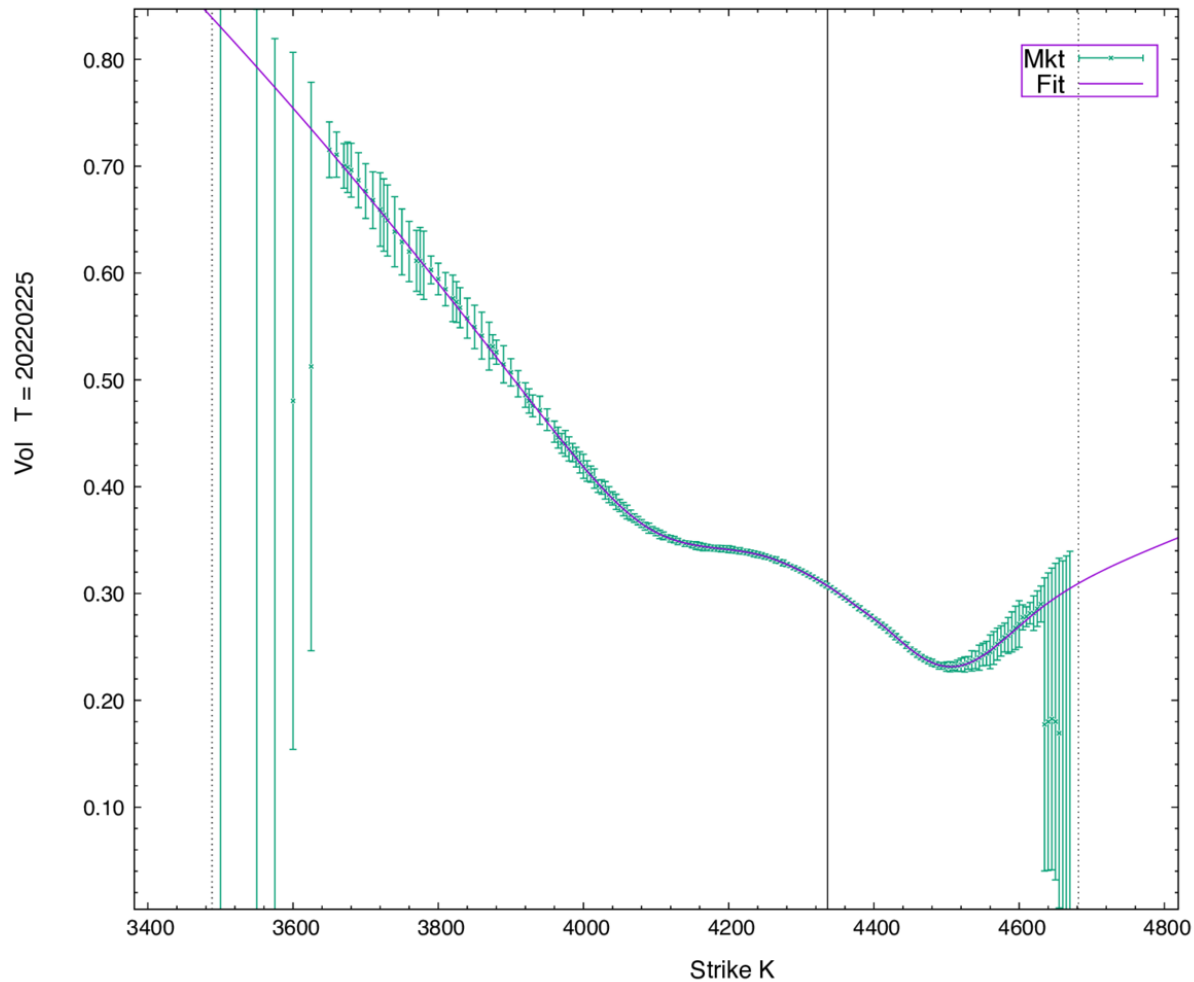
- On 2022-02-23, on the eve of the Ukraine invasion, the SPX daily expiry vol curve exhibited a peculiar, never-before-seen shape in the put wing.
- It lasted about 30 minutes, then disappeared, and the first expiry looked more like later expiries for the rest of the day.
- What does it mean?



SPX 20220223 9:41:03

T < 1d, in K-space

Putin's put wing – shape never seen before!

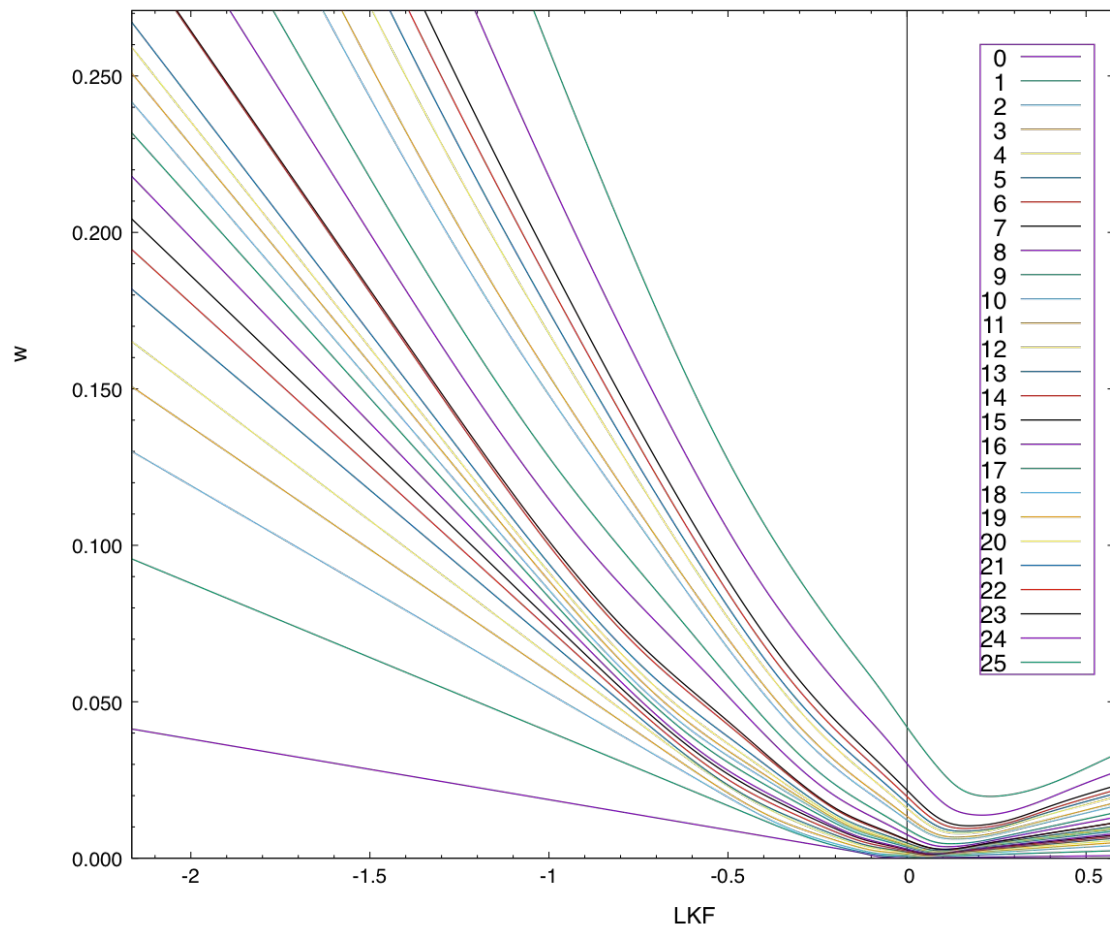


SPX 20220223 9:41:03

T < 3d, in K-space

The next expiry...

Total Vars SPXW 20220223-094103 C16m, chiAv=0.027, chiAvG=0.025, e5Av=1.6



SPX 2022-02-23

Day before Ukraine invasion

C16m **total variance** plot

No crossings! (even $i=14,15$)
No calendar arb!

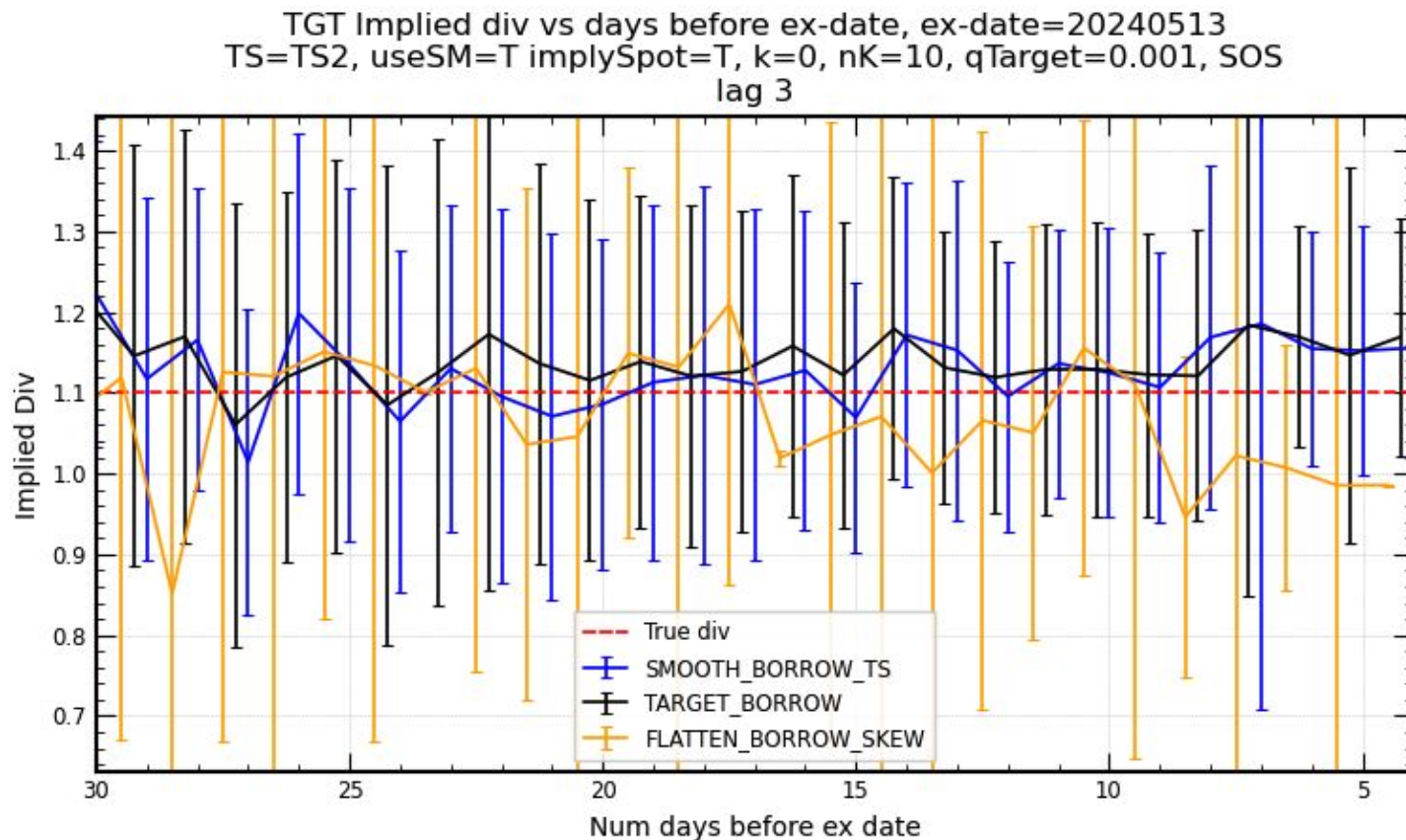
Just SPXW for clarity (and harder...)

Implying Dividends

- In practice, one often doesn't know the upcoming dividend amount or date, nor the borrow cost.
 - And sometimes the available spot price is not synchronous with the options!
- With (arbitrarily accurate) synthetic data, it is not hard to disentangle the different effects that borrows and cash dividends (or a wrong spot) have.
- In the real world, with noisy data, it's a much harder problem!
- To imply dividends:
 - If we know the borrow (and spot), it's *relatively* easy...
 - Eliminate "kinks" in the borrow term-structure.
 - Eliminate "borrow skew" (different implied borrows for different strikes).

TGT implied dividend, ex-date = 20240513

Realized dividend vs three different impliedDiv methods



Event Modeling

- Modeling an event like earnings properly requires a jump model.
 - With events at specific, non-random time(s).
- Minimal proper model: Two “**Merton Event Jumps**”, on top of a diffusive process, described by a “clean” aka “background” vol surface.
 - Various assumptions are possible about how to combine the clean surface with jumps.
 - Pricing: sum of Black formulas with an integral over jump sizes.
 - This is a proper model, unlike just describing the pdf of some expiry with a sum of log-normals, aka the Log-Normal Mixture “Model”.
 - So, one can ask if different expiries **consistent with the same jumps!**

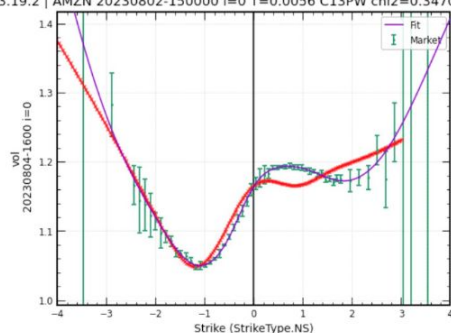
AMZN 2023-08-02 earnings

Calibrating three 2-jump models, with 2,3,4 parameters:

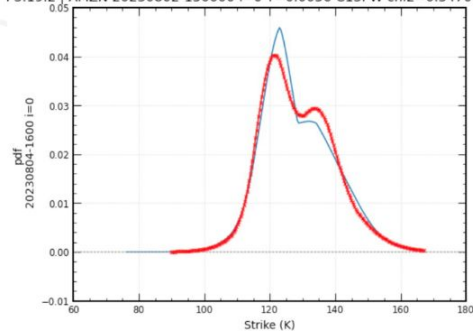
ASYMMETRIC_DISCRETE_JUMP

J= [0.0712686447685513, 0.9549850455121303]
p= [0.3871135291280911, 0.6128864708719088]
s= [0.0, 0.0]

3.19.2 | AMZN 20230802-150000 i=0 T=0.0056 C13PW chi2=0.3470 av



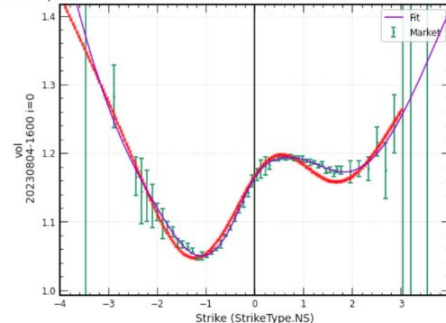
3.19.2 | AMZN 20230802-150000 i=0 T=0.0056 C13PW chi2=0.3470 av



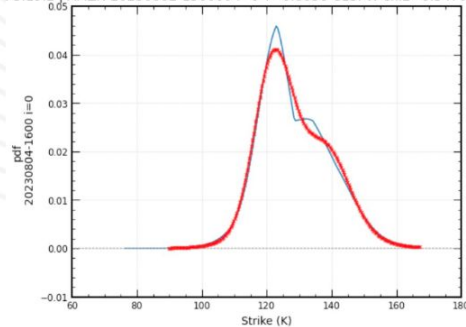
ASYMMETRIC_MERTON_JUMP

J= [0.9555676988524993, 1.0839264422585266]
p= [0.6538428160912148, 0.34615718390878525]
s= [0.044851664518220605, 0.044851664518220605]

3.19.2 | AMZN 20230802-150000 i=0 T=0.0056 C13PW chi2=0.3470 av



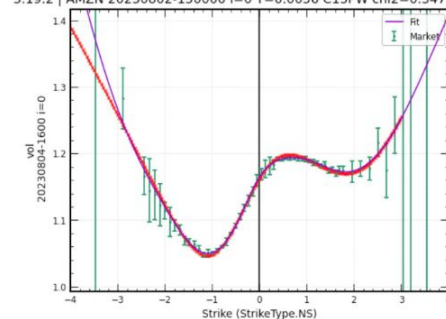
3.19.2 | AMZN 20230802-150000 i=0 T=0.0056 C13PW chi2=0.3470 av



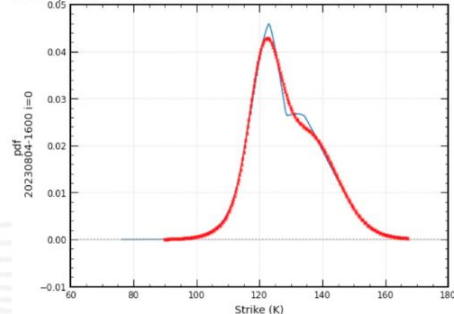
ASYMMETRIC_MERTON_JUMPS

J= [1.0594025258161424, 0.9441995069221296]
p= [0.48436658703542335, 0.5156334129645767]
s= [0.058806555709617, 0.03688014214112789]

3.19.2 | AMZN 20230802-150000 i=0 T=0.0056 C13PW chi2=0.3470 av



3.19.2 | AMZN 20230802-150000 i=0 T=0.0056 C13PW chi2=0.3470 av

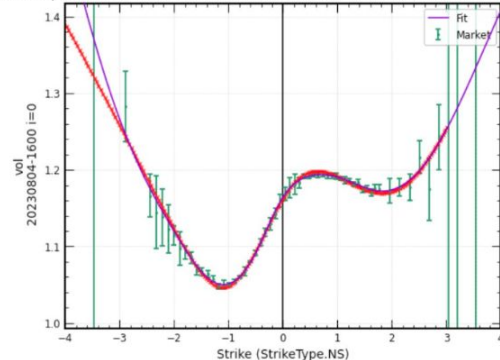


nAfter=3
vctC = C5

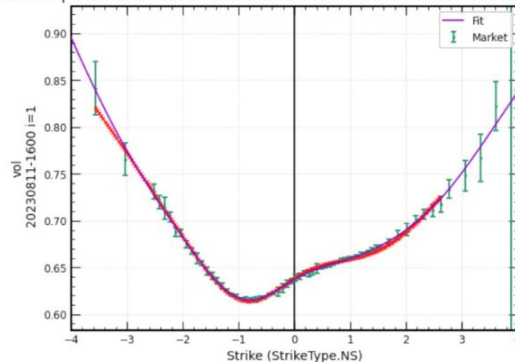
AMZN 2023-08-02 earnings

The best 2-jump model works for three expiries after earnings:

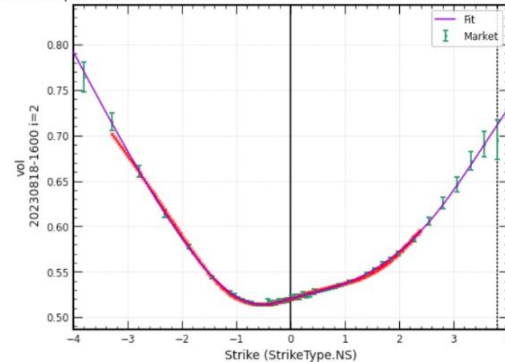
3.19.2 | AMZN 20230802-150000 i=0 T=0.0056 C13PW chi2=0.3470 avg



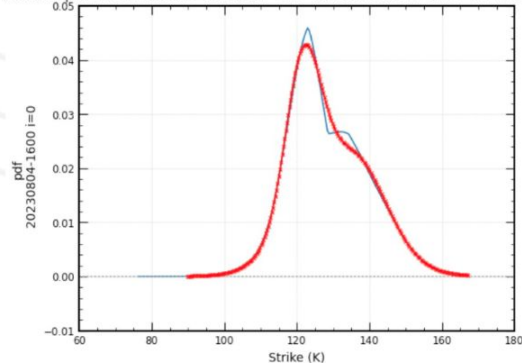
3.19.2 | AMZN 20230802-150000 i=1 T=0.0248 C13PW chi2=0.1796 avg



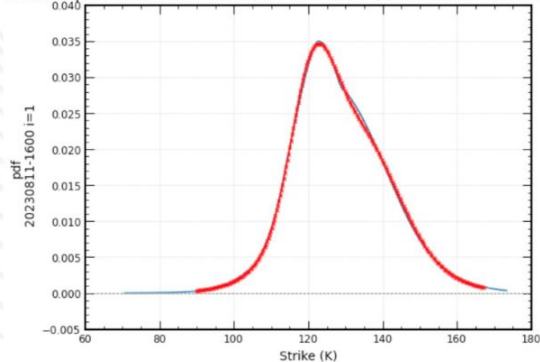
3.19.2 | AMZN 20230802-150000 i=2 T=0.0439 C13PW chi2=0.1948 avg



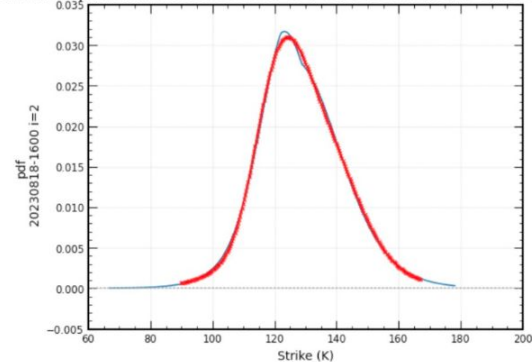
3.19.2 | AMZN 20230802-150000 i=0 T=0.0056 C13PW chi2=0.3470 avg



3.19.2 | AMZN 20230802-150000 i=1 T=0.0248 C13PW chi2=0.1796 avg



3.19.2 | AMZN 20230802-150000 i=2 T=0.0439 C13PW chi2=0.1948 avg



AMZN 2023-08-02 earnings

Calibrating three 2-jump models, with 2,3,4 parameters:

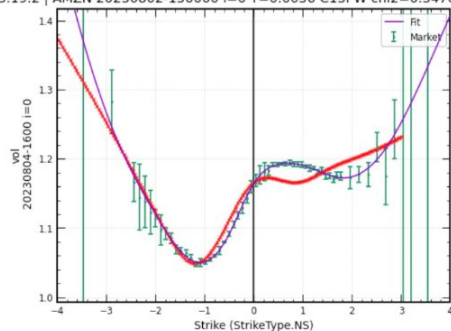
ASYMMETRIC_DISCRETE_JUMP

J= [0.0712686447685513, 0.9549850455121303]

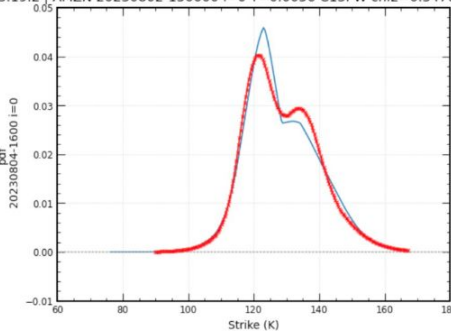
p= [0.3871135291280911, 0.6128864708719088]

s= [0.0, 0.0]

3.19.2 | AMZN 20230802-150000 i=0 T=0.0056 C13PW chi2=0.3470 av



3.19.2 | AMZN 20230802-150000 i=0 T=0.0056 C13PW chi2=0.3470 av



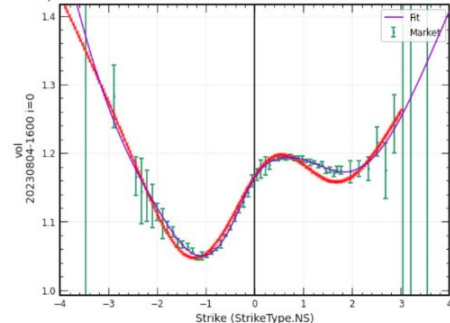
ASYMMETRIC_MERTON_JUMP

J= [0.9555676988524993, 1.0839264422585266]

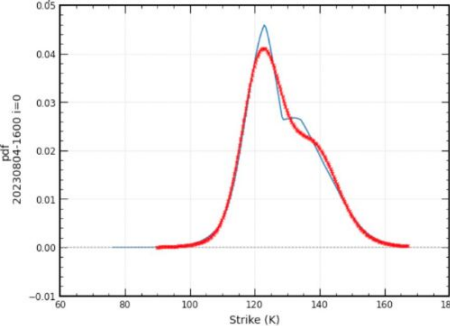
p= [0.6538428160912148, 0.34615718390878525]

s= [0.044851664518220605, 0.044851664518220605]

3.19.2 | AMZN 20230802-150000 i=0 T=0.0056 C13PW chi2=0.3470 av



3.19.2 | AMZN 20230802-150000 i=0 T=0.0056 C13PW chi2=0.3470 av



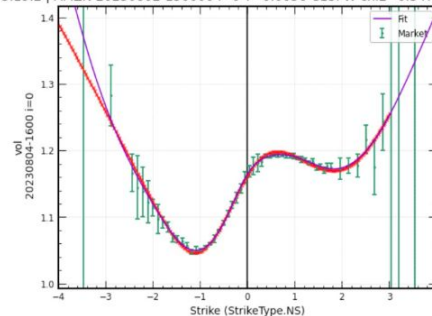
ASYMMETRIC_MERTON_JUMPS

J= [1.0594025258161424, 0.9441995069221296]

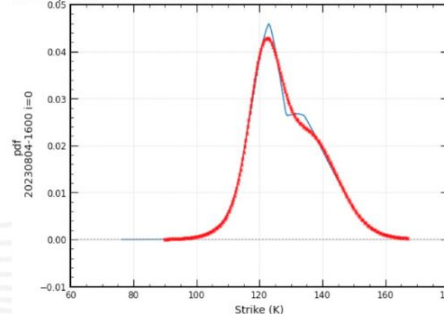
p= [0.48436658703542335, 0.5156334129645767]

s= [0.058806555709617, 0.03688014214112789]

3.19.2 | AMZN 20230802-150000 i=0 T=0.0056 C13PW chi2=0.3470 av



3.19.2 | AMZN 20230802-150000 i=0 T=0.0056 C13PW chi2=0.3470 av

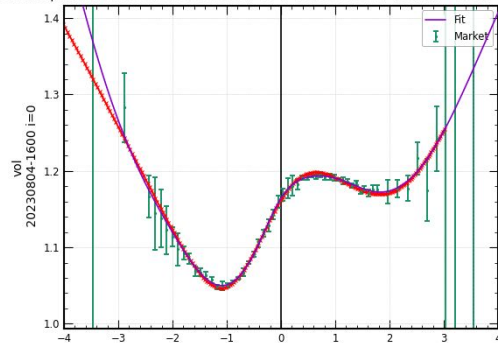


nAfter=3
vctC = C5

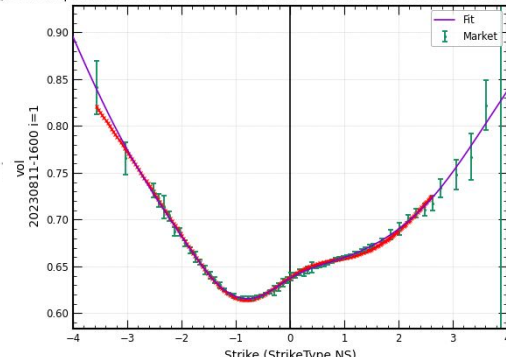
AMZN 2023-08-02 earnings

The best 2-jump model works for three expiries after earnings:

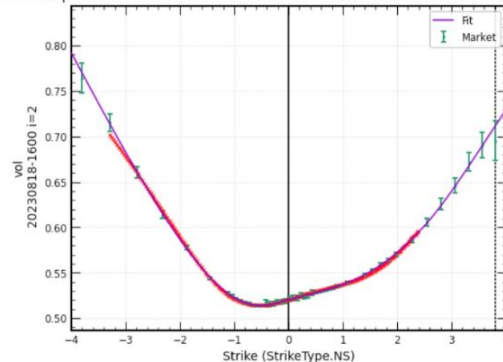
3.20.1 | AMZN 20230802-150000 i=0 T=0.0056 C13PW chi2=0.3470 avgE5



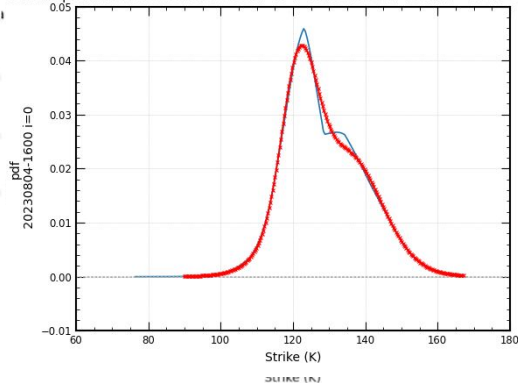
3.20.1 | AMZN 20230802-150000 i=1 T=0.0248 C13PW chi2=0.1796 avgE5



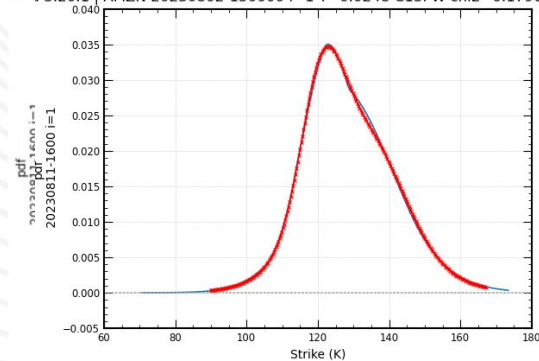
3.19.2 | AMZN 20230802-150000 i=2 T=0.0439 C13PW chi2=0.1948 avgE5



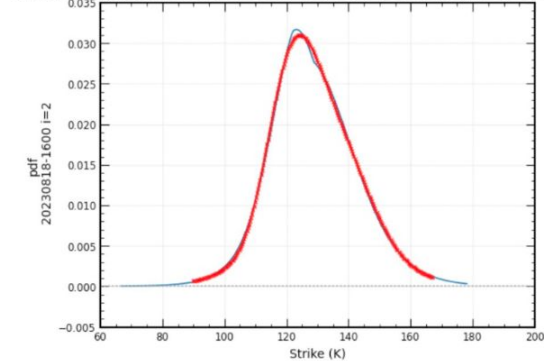
3.20.1 | AMZN 20230802-150000 i=0 T=0.0056 C13PW chi2=0.3470 avgE5



3.20.1 | AMZN 20230802-150000 i=1 T=0.0248 C13PW chi2=0.1796 avgE5



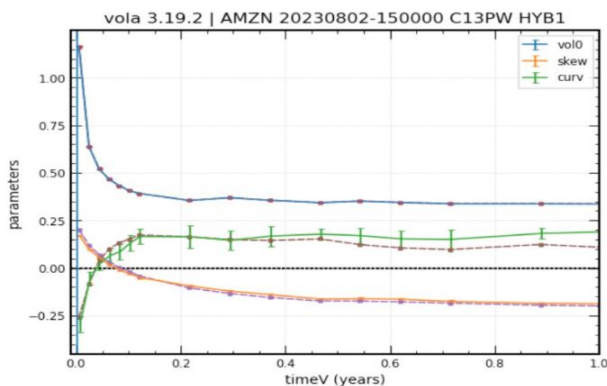
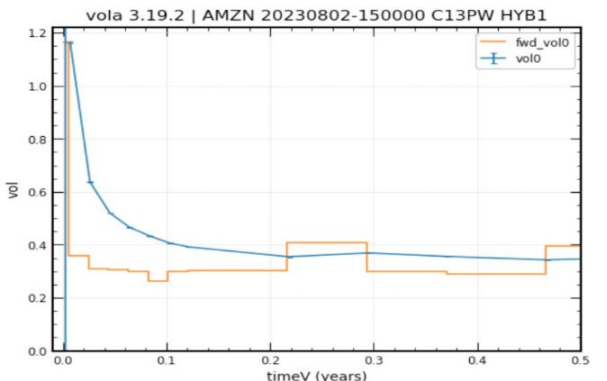
3.19.2 | AMZN 20230802-150000 i=2 T=0.0439 C13PW chi2=0.1948 avgE5



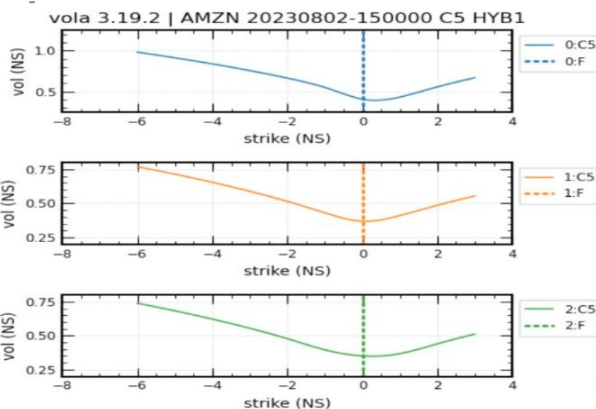
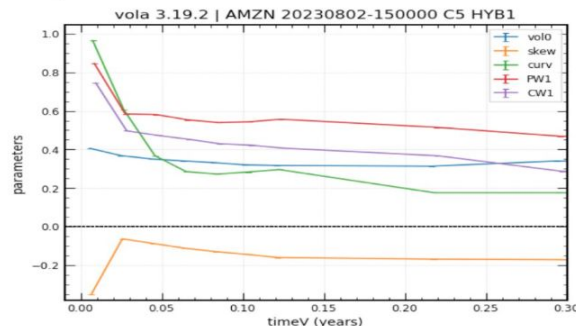
AMZN 2023-08-02 earnings

Though the clean VS is not quite as clean as we would like:

Dirty



Clean

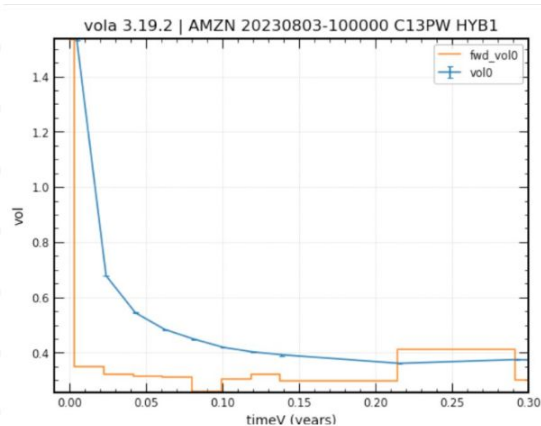


nAfter=3
vctC = C5
MertonJumps

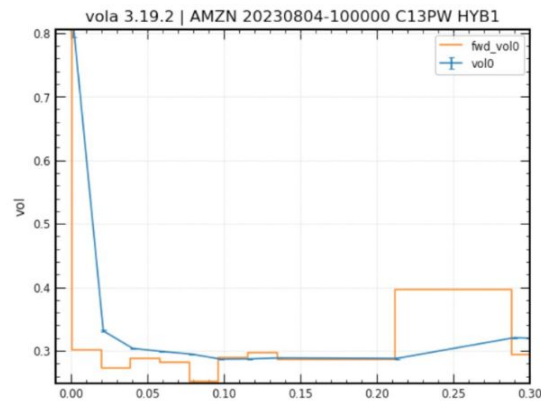
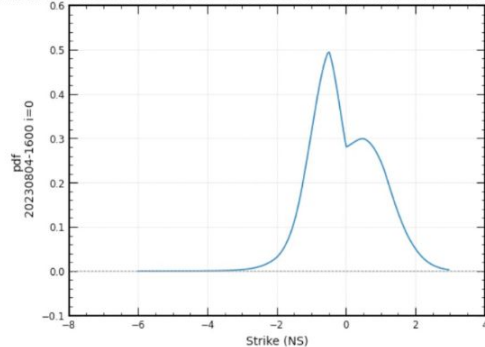
J= [1.0594025258161424, 0.9441995069221296]
p= [0.48436658703542335, 0.5156334129645767]
s= [0.0588065555709617, 0.03688014214112789]

AMZN 2023-08-02 earnings

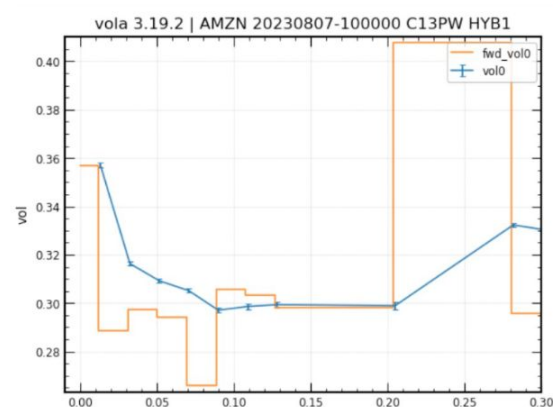
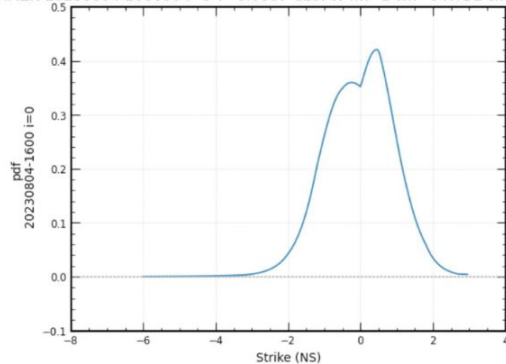
The event is not quite discrete in time, there are “aftershocks”:



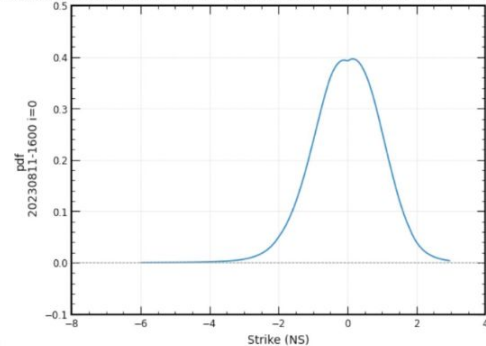
AMZN 20230803-100000 i=0 T=0.0034 C13PW fm=1 cm=0 HYB1 chi2=



AMZN 20230804-100000 i=0 T=0.0007 C13PW fm=1 cm=0 HYB1 chi2=



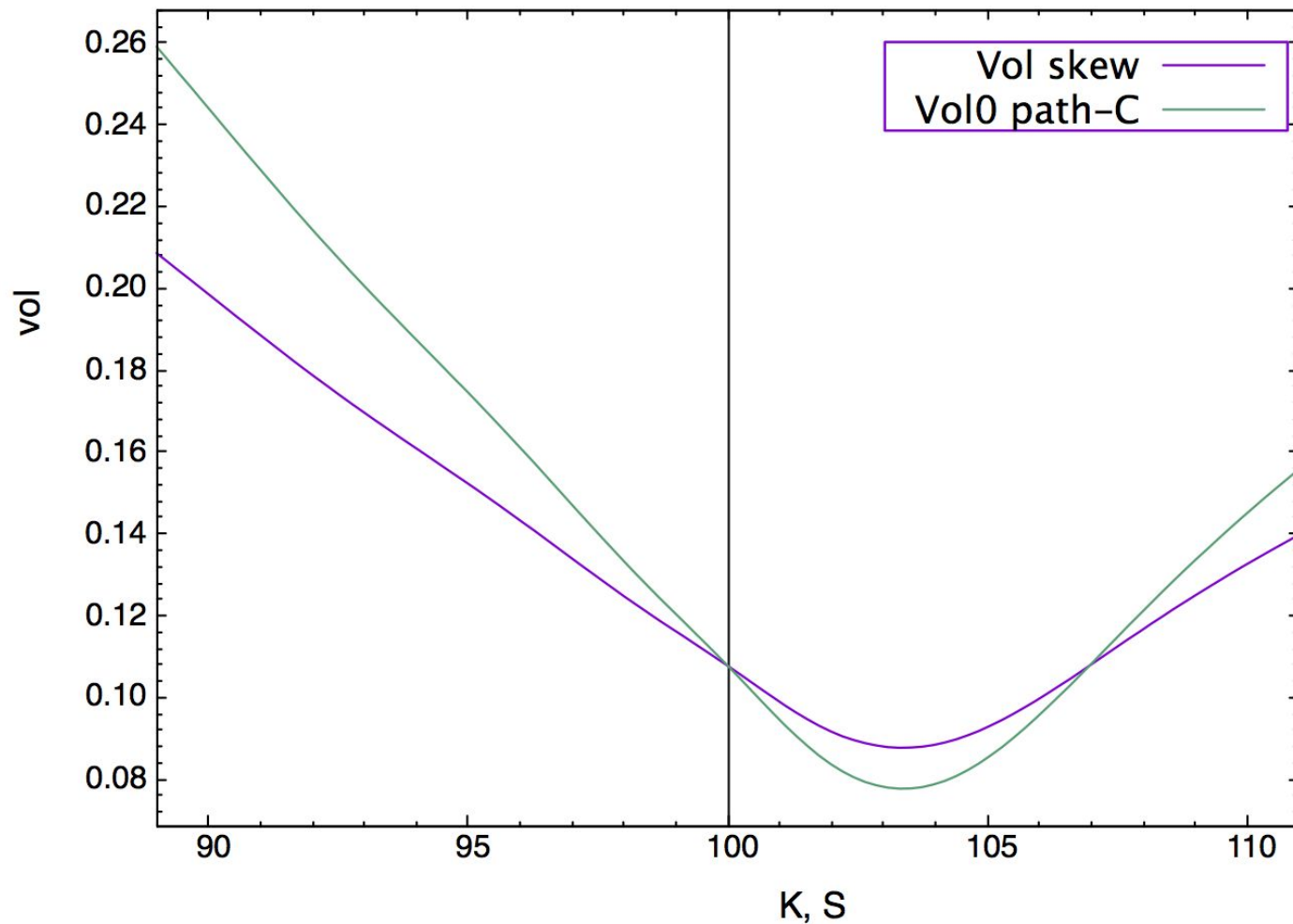
AMZN 20230807-100000 i=0 T=0.0116 C13PW fm=1 cm=0 HYB1 chi2=



Spot-Vol Dynamics: Basics

- **Shape** (by NS or Δ) is much more **stable** than overall vol level (vol0 aka ATF vol).
- **ATF vol dynamics** is very well described by one dimensionless number, **SSR** aka vol sensitivity aka super-skew, which is the ratio of vol0-path & skew slopes.
- Very **simple dynamics** in terms of NS **vol parameters** (e.g. just ATF vol), gives **complicated vol-by-strike dynamics**, that actually describes market moves.
 - It also gives the correct adjusted (aka smart aka **skew**) **delta** and gamma (see LinkedIn article).
- We will illustrate each of these points.

ATF Vol path (C8, volSensi = 1.5, clampFac = 0.2)



Spot-Vol Dynamics

ATF “vol path”

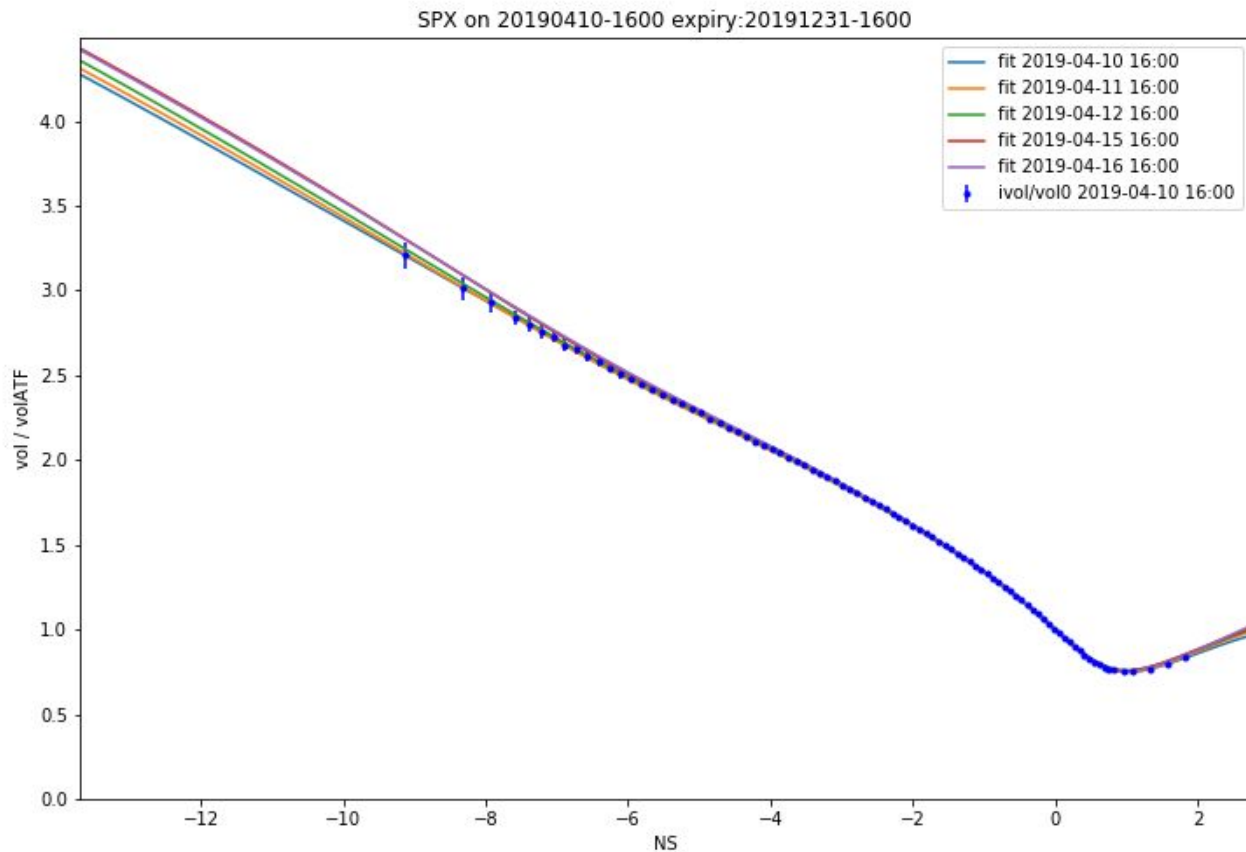
SSR = 1.5

“Along curve”

No clamps

SPX Spot-Vol Dynamics: Then and Now

- In the olden days:
 - Virtually no shape dynamics.
 - Overall vol level dynamics described very well by one SSR with little term-structure (TS).
 - $1 < SSR < 2$, with 2 reached only on big down days. Typical value $SSR=1.3$.
- Nowadays:
 - There is often **term-structure** in SSR, with $SSR(T > 1y)$ closer to typical values.
 - There is occasionally, e.g. on some big down days, **shape dynamics**, eg in c2.
 - **$SSR > 2$ and $SSR < 1$** can happen, on short end.
 - Some horizon dependence (1min, 5min, etc), including intraday vs overnight differences.
 - More “fluctuations”, in **path-dependent** manner (cf. Guyon), around typical values.
 - Open Q: How strong is path-dependency effect relative to levels set by “SSR regime” ?

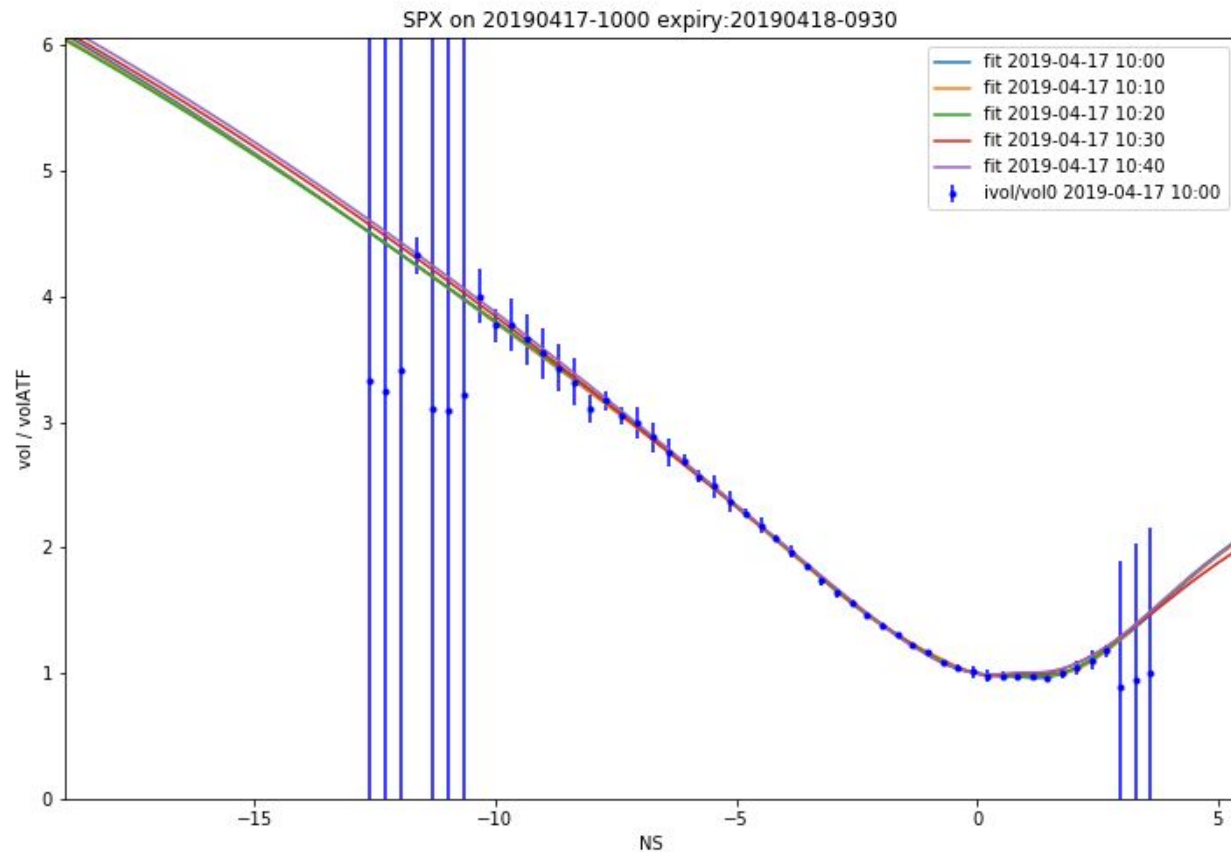


Stability of NS Shape

SPX 20190410 T = 9m

Shape **stable over many days**,
while underlier moves around.

Also, no floppy wings!

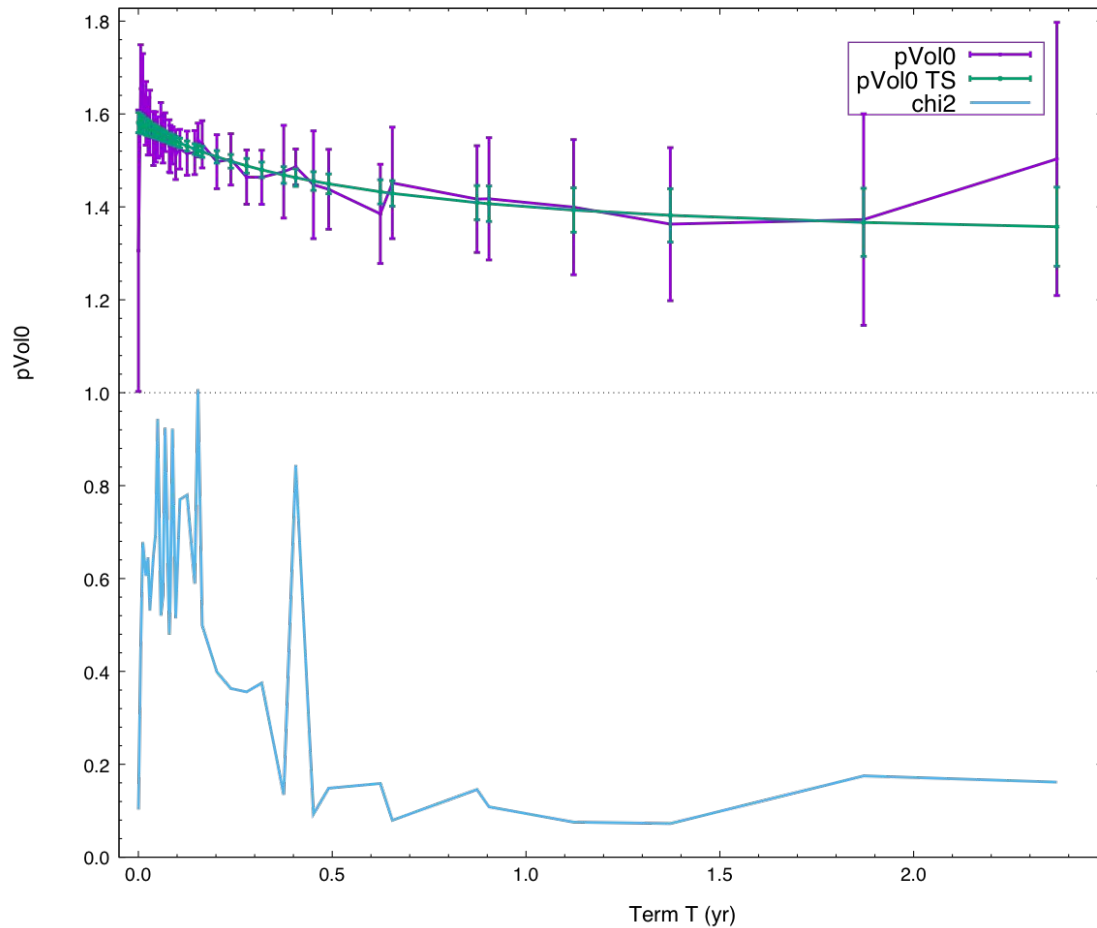


Stability of NS Shape

SPX 20190410 T = 1d

Shape stable even on last day

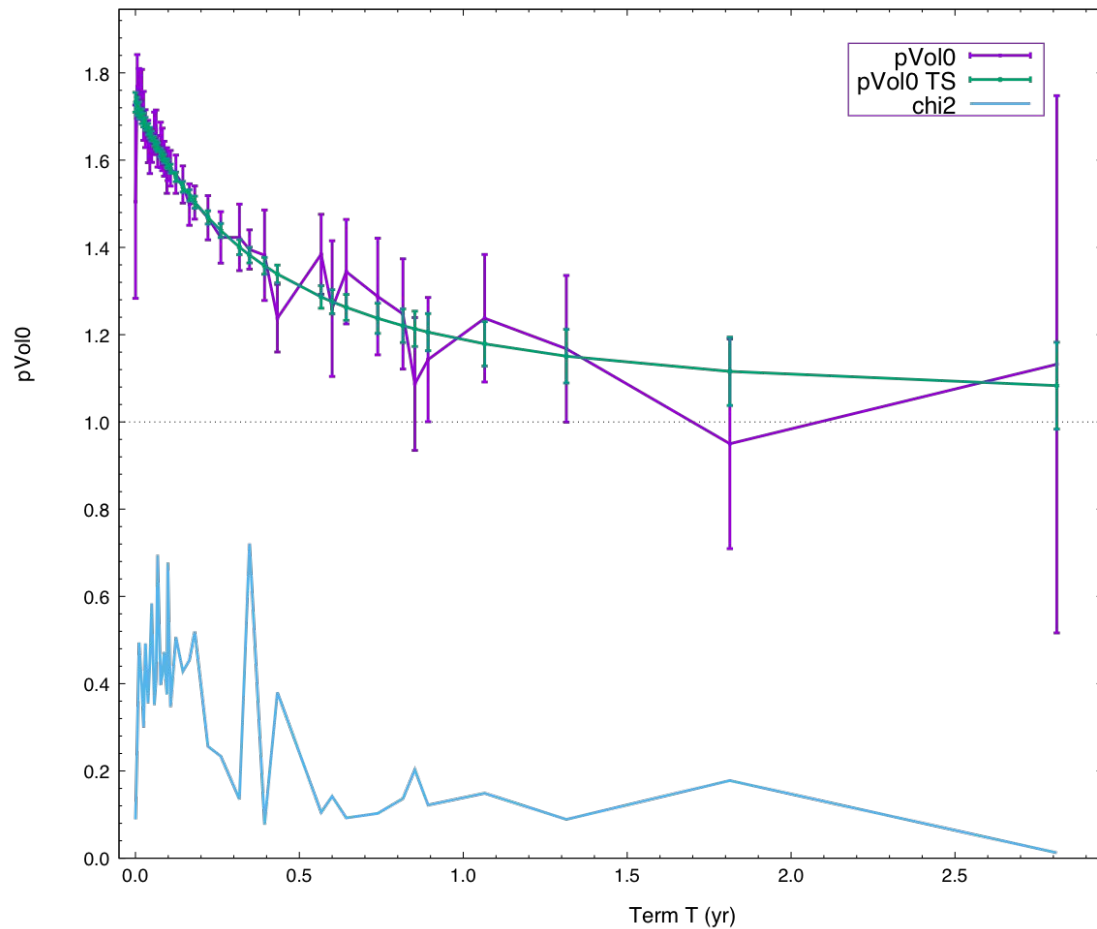
Also, no floppy wings!



SPX 20190805

Vol sensitivity (SSR) term-structure

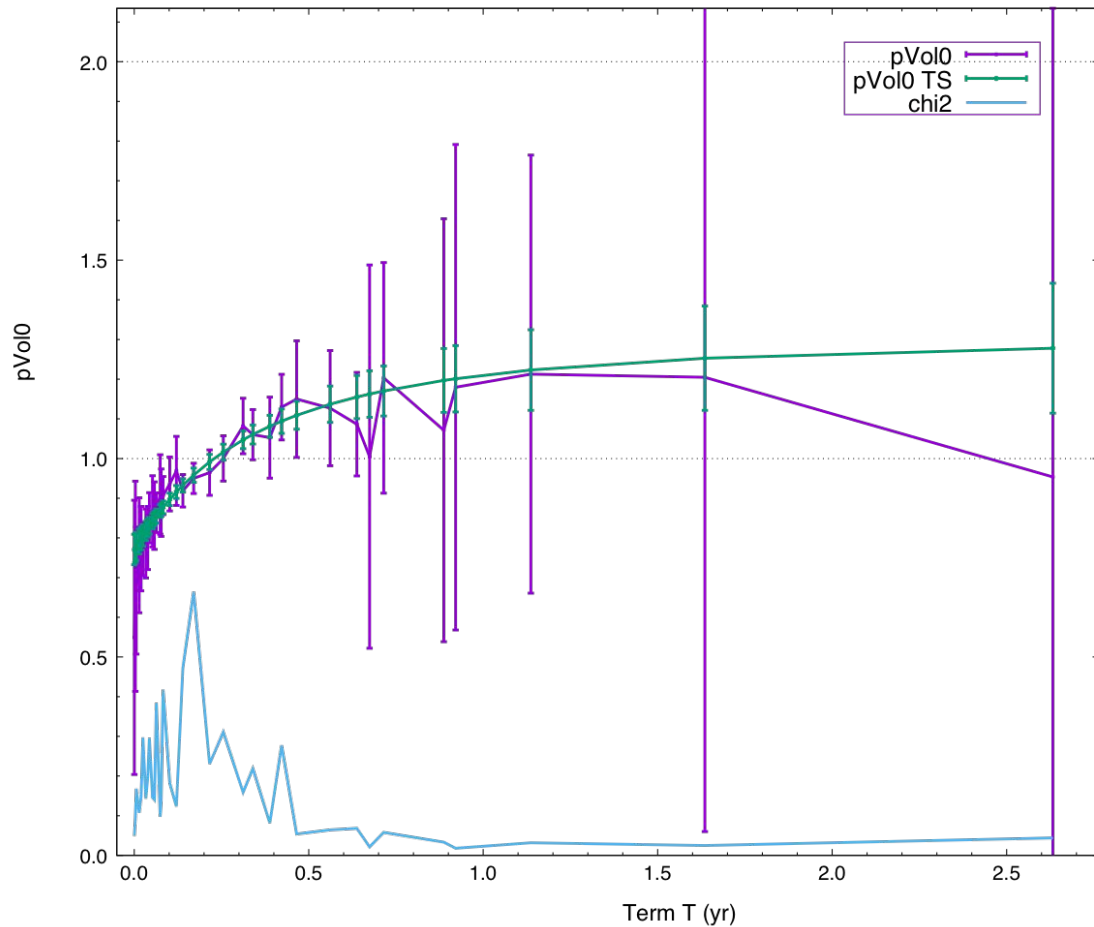
Parametric fit for robustness on small data sets (can be done intra-day)



SPX 20200224

Vol sensitivity (SSR) term-structure

Parametric fit for robustness on
small data sets



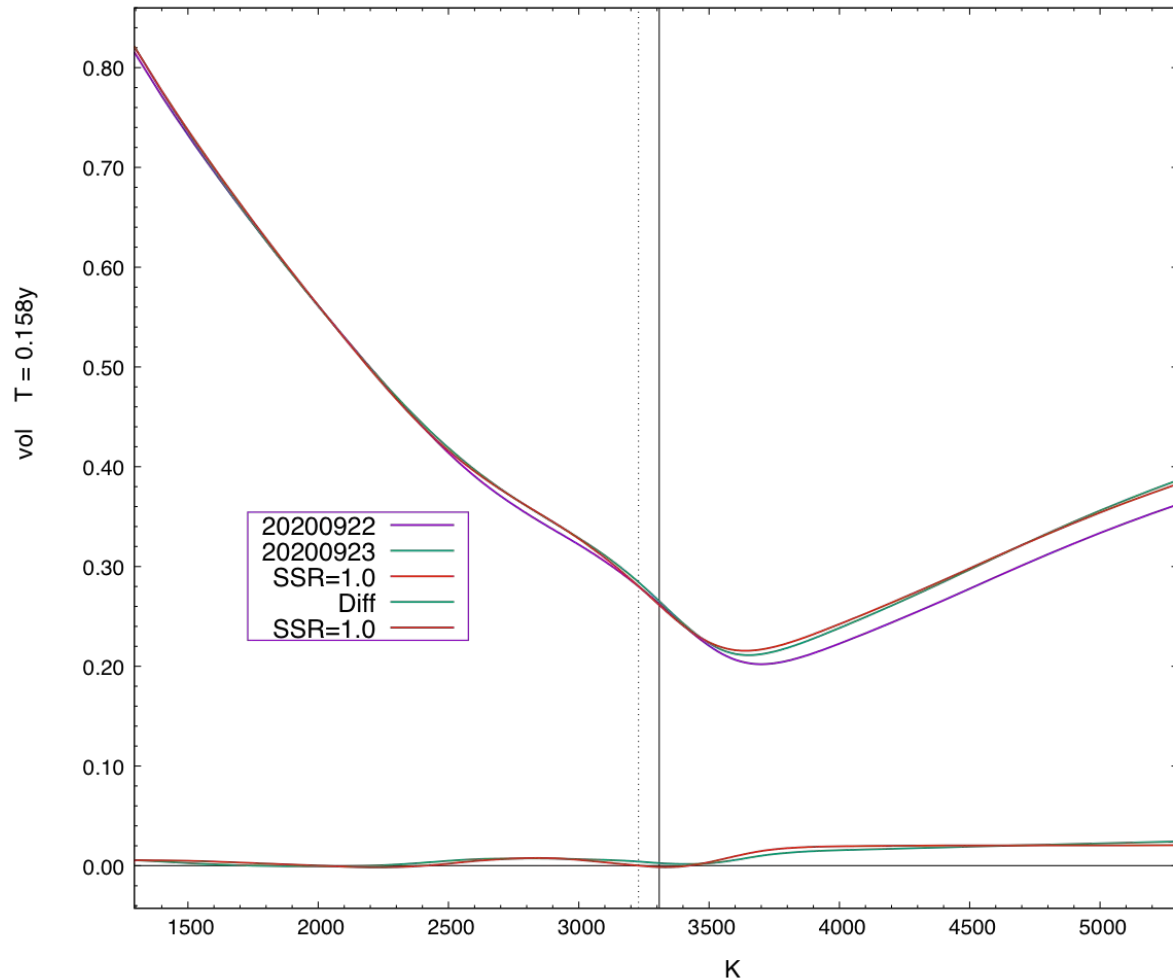
SPX 20200429

Vol sensitivity (SSR) term-structure

On up-days can be upward-sloping,
and SSR < 1 at least for some terms

Spot-Vol Dynamics Myths

- **Myth: Common “vol regimes” are “sticky-by-strike” or “sticky-by-delta”**
 - Sticky-strike scenarios are still commonly used by risk departments.
- In equities, at least, **neither has happened for 20y+.**
- Sticky-delta implies $SSR=0$ for all terms. Never happens.
- Sticky-strike implies $SSR=1$ (i.e. sticky-strike around ATM).
 - Even when vols are sticky-by-strike around ATM, they never are in the wings.
 - There are many examples. Let's look at some.



Close-to-close spot vol dynamics

SPX 2020-09-22 to 2020-09-23

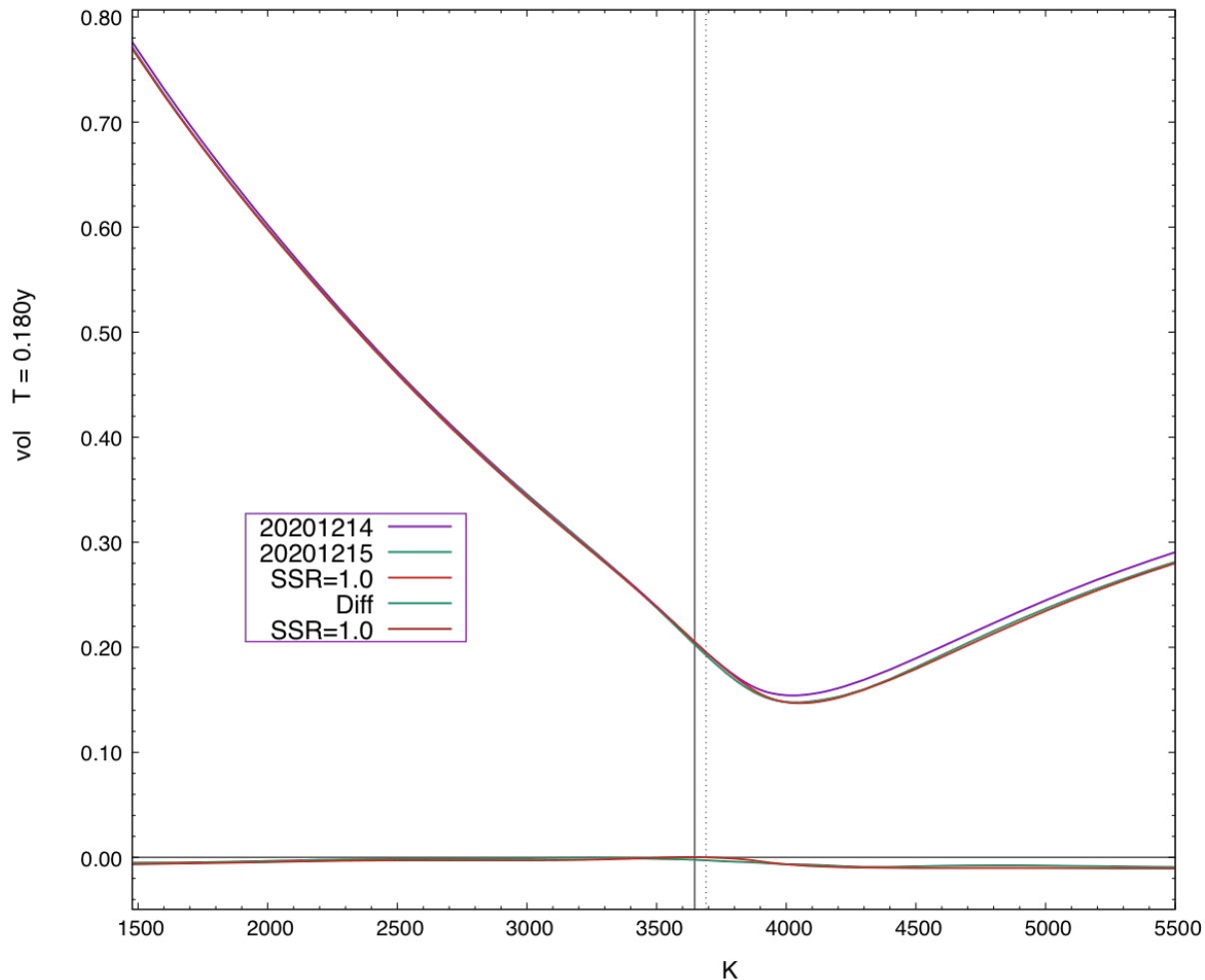
SSR=1, but NO sticky strike in the wings.

Instead: **Shapes are sticky-by-NS!**

Non-trivially so in the call and put wing!

This down-day comes after a sequence of (minor) down days, and SSR has mean-reverted to 1.0

SPX 20201214 to 20201215, return = 1.2%, T = 20210219

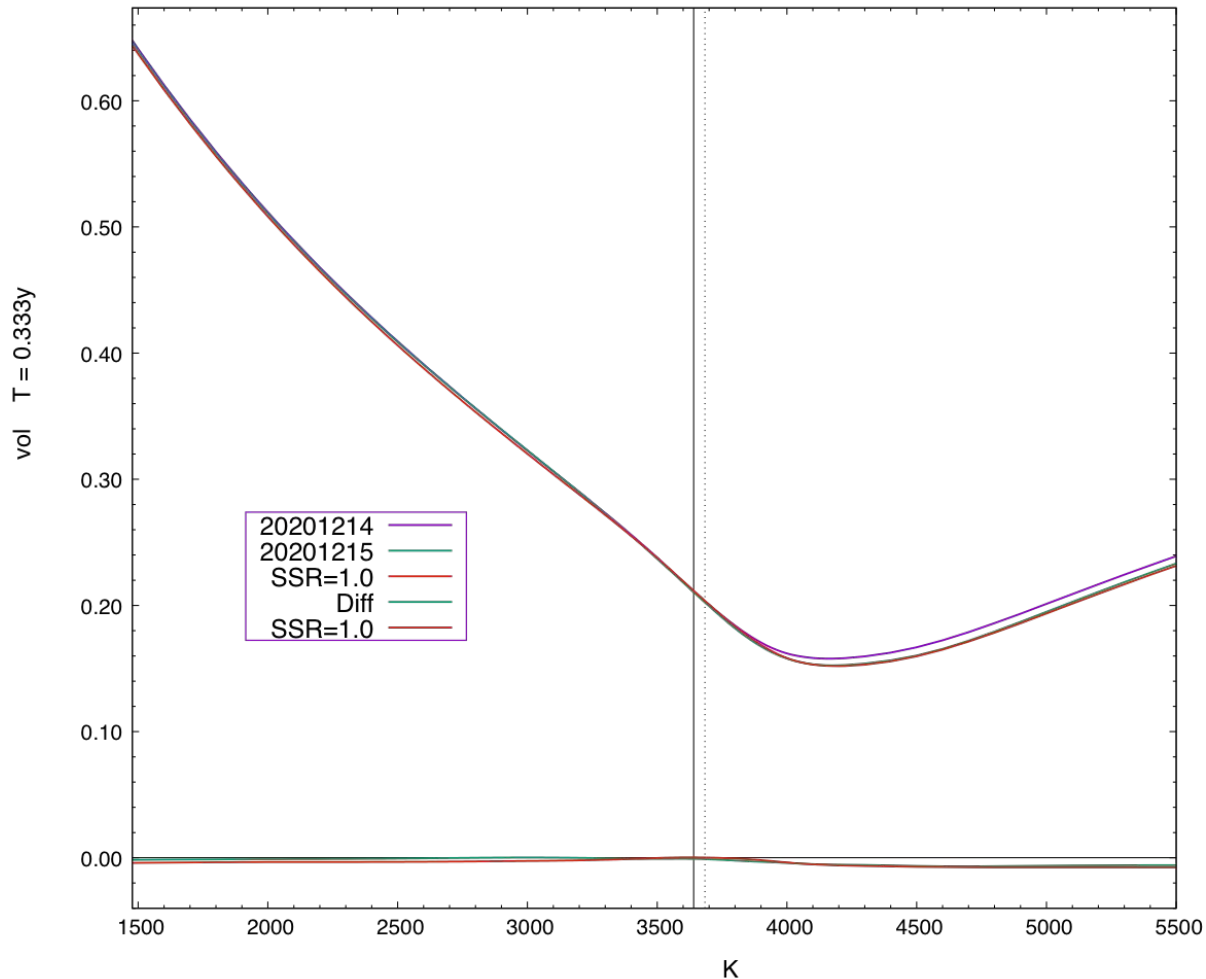


Close-to-close spot vol dynamics

SPX 2020-12-14 to 2020-12-15

T = 9w, SSR = 1

Fixed NS shape assumption
works **amazingly** well!

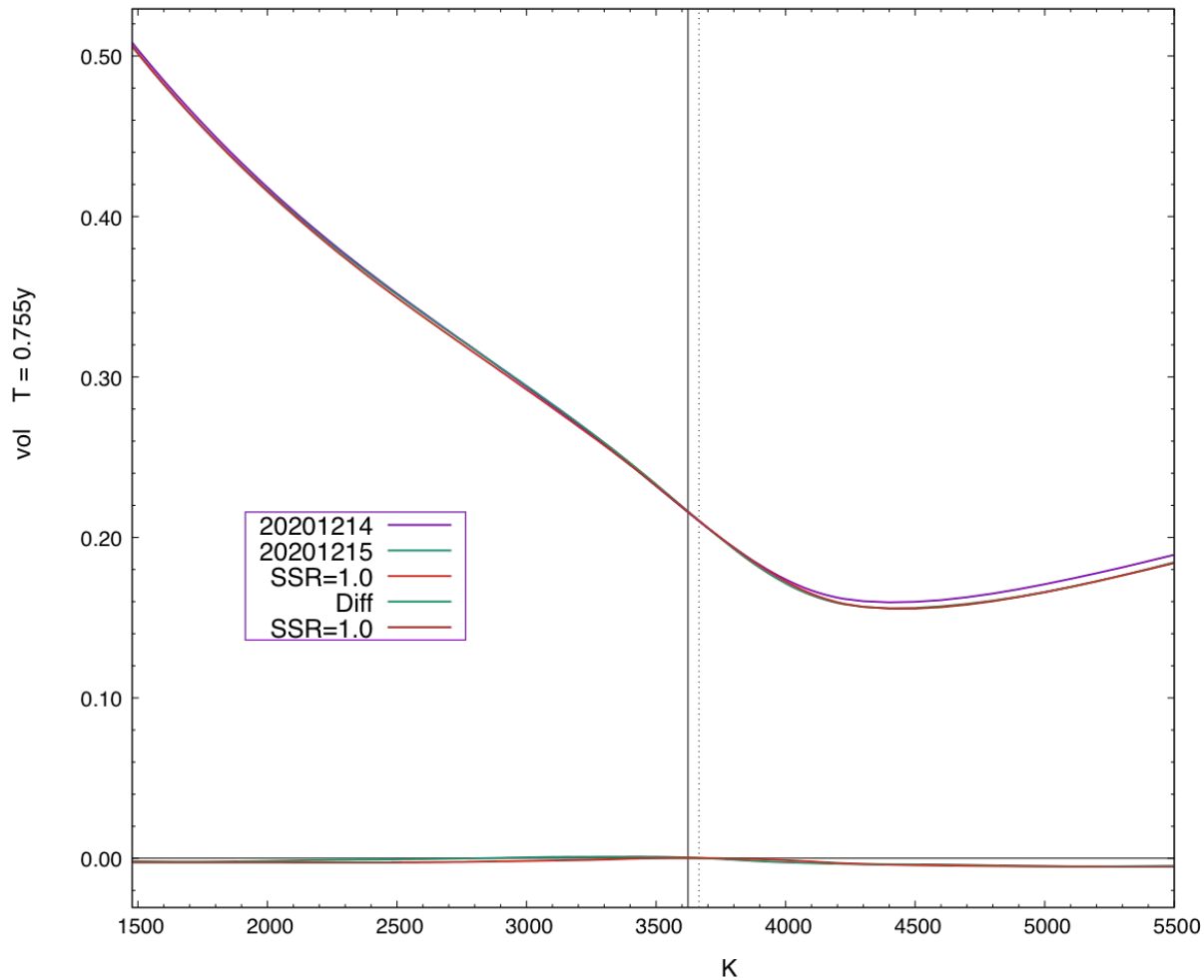


Close-to-close spot vol dynamics

SPX 2020-12-14 to 2020-12-15

$T = 4m$, $SSR = 1$

Fixed NS shape assumption
works **amazingly** well!

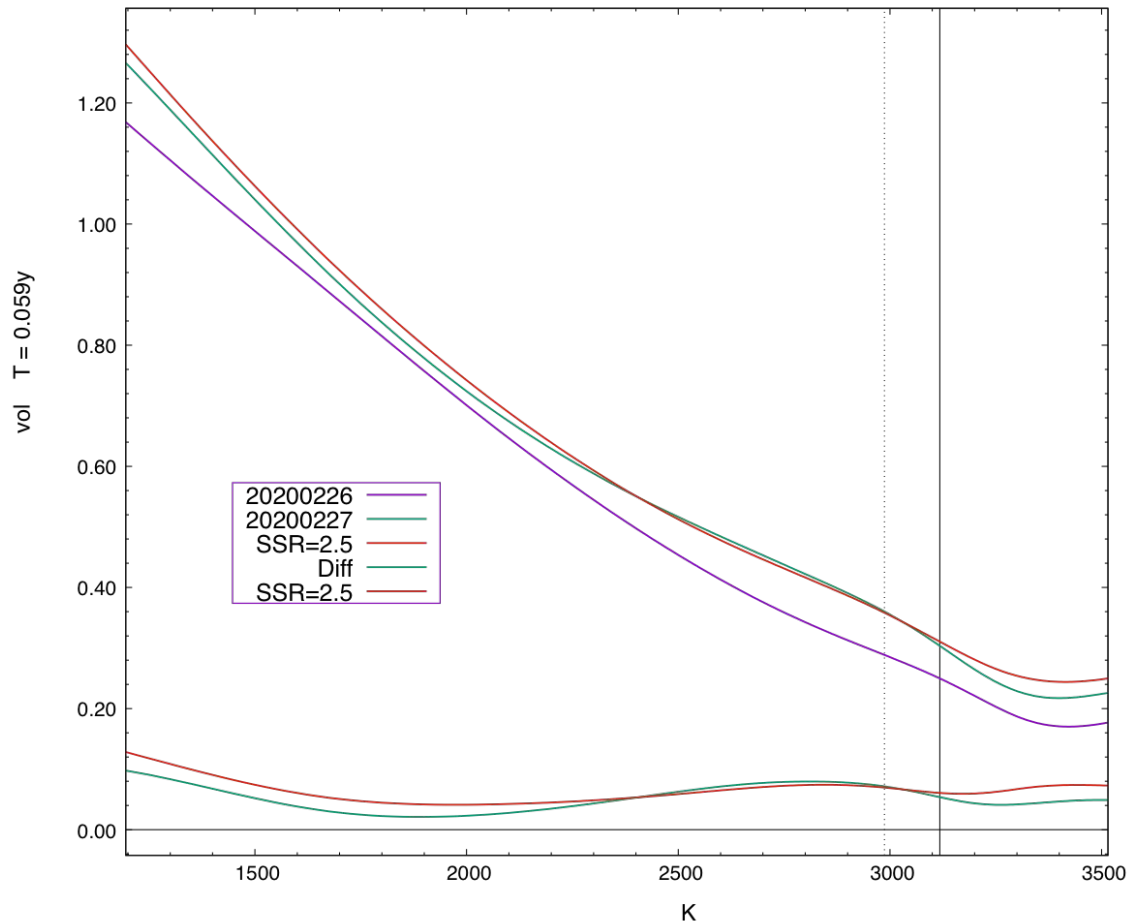


Close-to-close spot vol dynamics

SPX 2020-12-14 to 2020-12-15

$T = 9m$, $SSR = 1$

Fixed NS shape assumption
works **amazingly** well!



Close-to-close spot vol dynamics

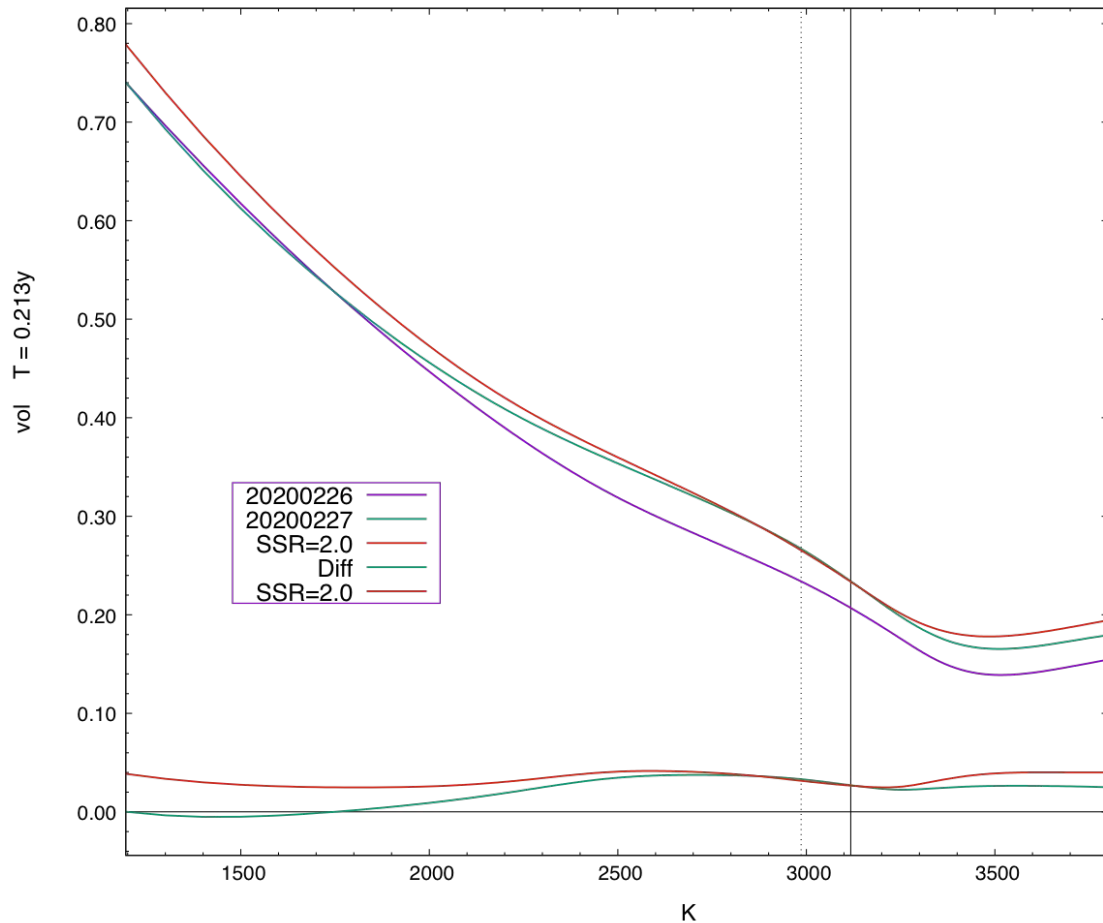
SPX 2020-02-26 to 2020-02-27

Covid crash!

T = 3w, SSR = 2.5

Evidence for c2-spot-sensitivity > 0

SPX 20200226 to 20200227, return = -4.2%, $T = 20200515$



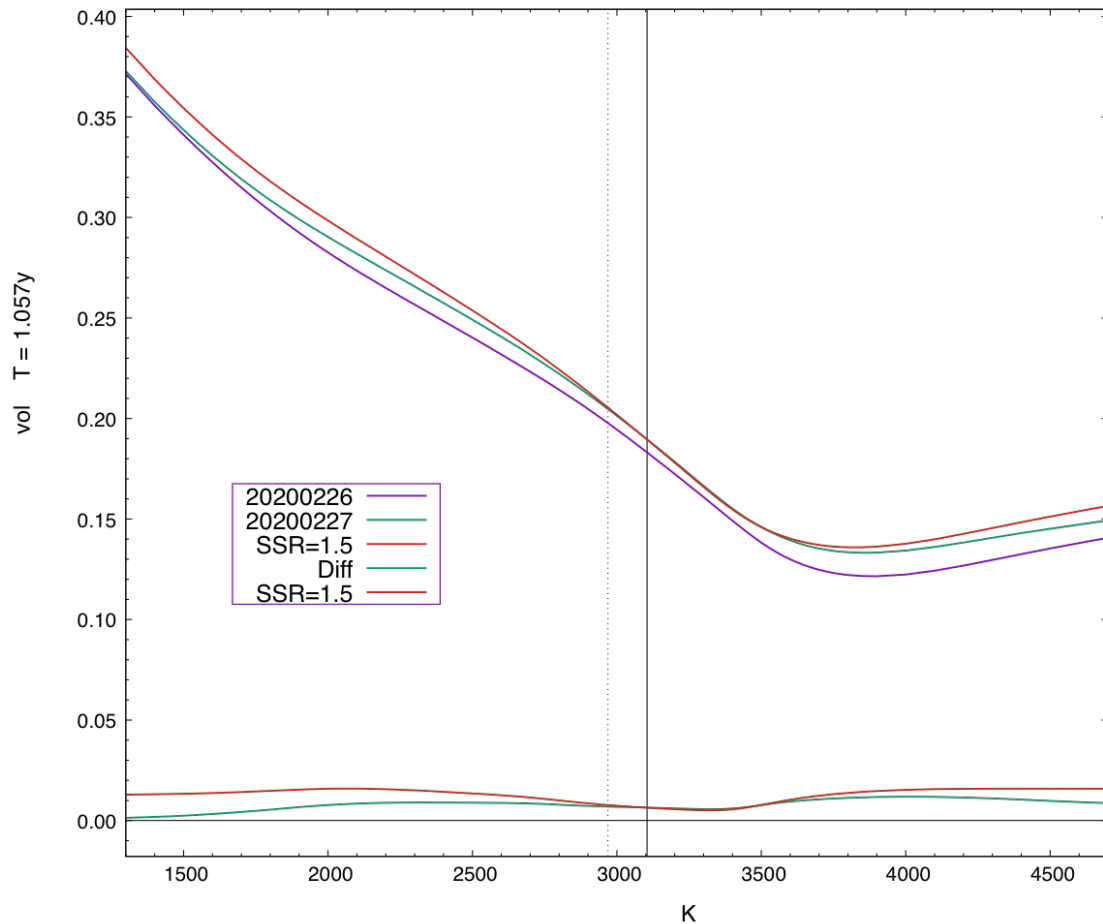
Close-to-close spot vol dynamics

SPX 2020-02-26 to 2020-02-27

Covid crash!

$T = 2.5m$, **SSR = 2.0**

Evidence for $c2\text{-spot-sensitivity} > 0$



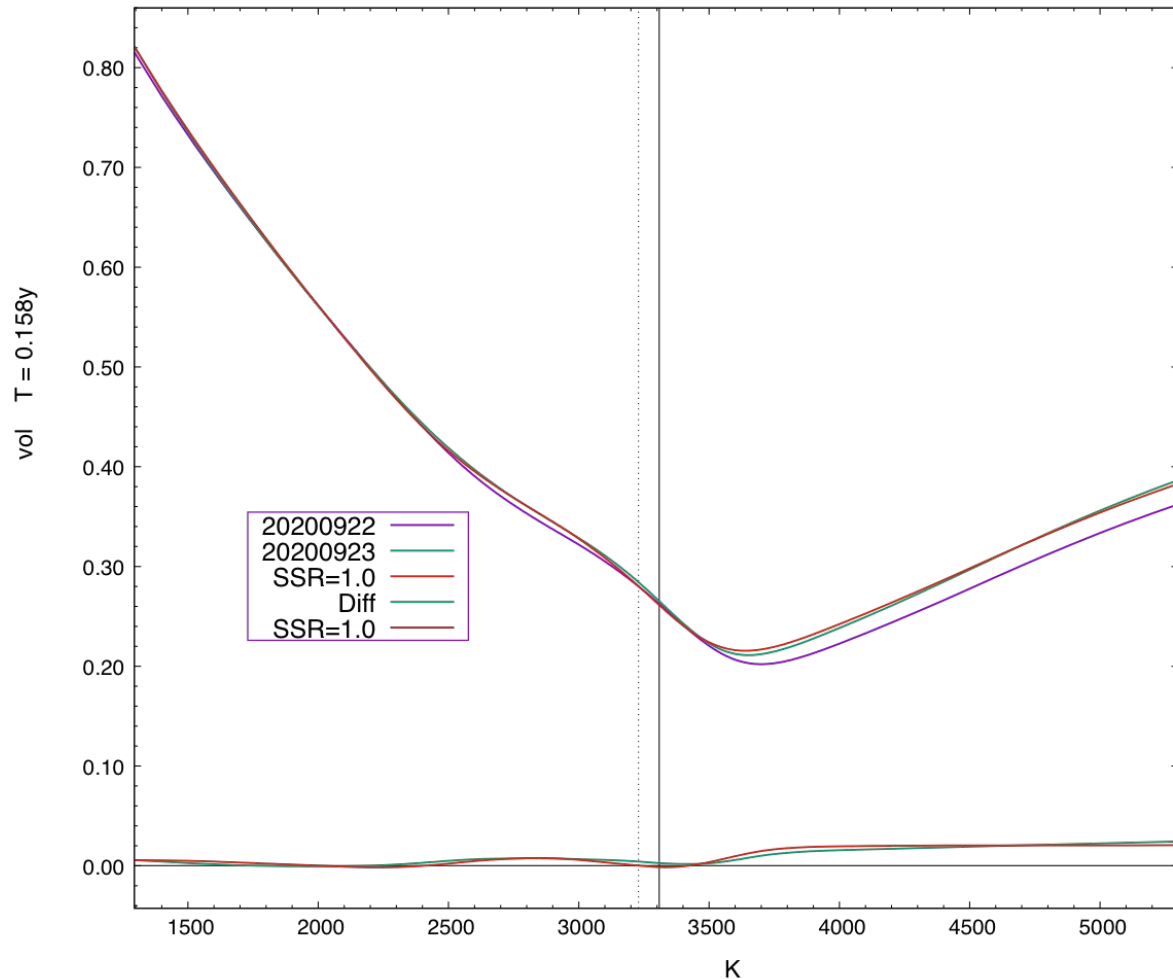
Close-to-close spot vol dynamics

SPX 2020-02-26 to 2020-02-27

Covid crash!

T = 1y, SSR = 1.5

Evidence for c2-spot-sensitivity > 0



Close-to-close spot vol dynamics

SPX 2020-09-22 to 2020-09-23

SSR=1, but NO sticky strike in the wings.

Instead: **Shapes are sticky-by-NS!**

Non-trivially so in the call and put wing!

This down-day comes after a sequence of (minor) down days, and SSR has mean-reverted to 1.0

Subtleties of Pricing American “vanillas”

- In the olden days:
 - Could price every vanilla, European or American, with one flat r , q , and vol.
 - The same vol would work (well enough...) for call and put at same T, K .
- Already pretty hard, especially in real time. One needs:
 - A proper **cash dividend model** (no consensus even for vanilla...).
 - Handle **settlement** effects (incl. exchange and bank holidays).
 - A good choice of “**vol time**” (aka “business time”), including “**events**”.
 - NOTE: Pricing with vol time is equivalent to pricing with a (particular) vol term-structure.
 - Then: imply “SPIBOR” (~daily), borrows (real time), and vol surfaces (real time).
 - “American PCP” condition to imply borrow: Demand $\text{volP}(K) = \text{volC}(K)$ around ATM

Subtleties of Pricing American “vanillas” 2

- Now: How fancy does the modeling have to be? (“De-Americanization”)
 - BS: (1) Flat r, q, vol (2) $r(t), q(t), \text{vol}$ (3) $r(t), q(t), \text{vol}(t)$ for each $K(?)$
 - Beyond-BS: (4) $r(t), q(t), \text{LV}$, (5) $r(t), q(t), \text{SLV}$, (6) Other (approx/hacks...)
- Empirically in US: One definitely needs rate TS, vol-time including events, settlement, proper dividend modeling.
- In Europe: Evidence that local vols (or roughly equiv approx's) are being used.
- Let's look at some examples:
 - Rate TS and event effects: MSFT, TSLA, TGT
 - Settlement effects (+more): SPX

Event Time Effect on Pricing American Vanillas

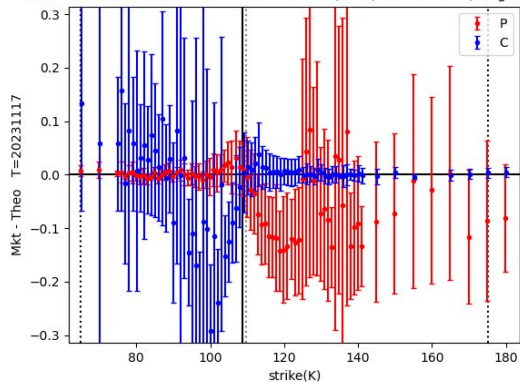
TGT 2023-11-08

Target has a dividend and earnings call just before expiry $T=2023-11-17$ ($i=1$).

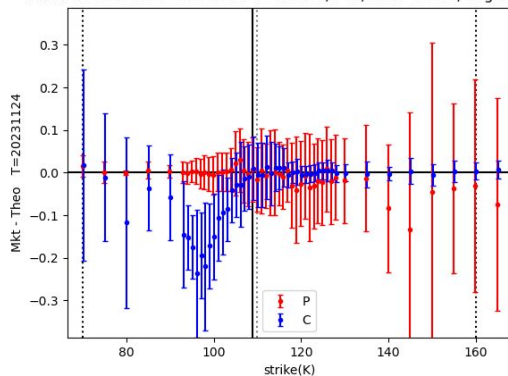
Top row: Without an “event time” an implied borrow allows (OTM and ITM) market prices to be matched at a few strikes, but not all.

Bottom row: With an event time of 0.09y all prices can be matched, in all expiries!

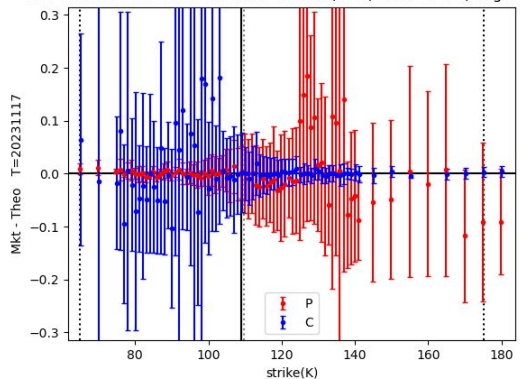
TGT 20231108-153000 C10W: $T=0.0247$, $i=1$, $\chi^2=0.086$, $\text{avgE5}=9.7$



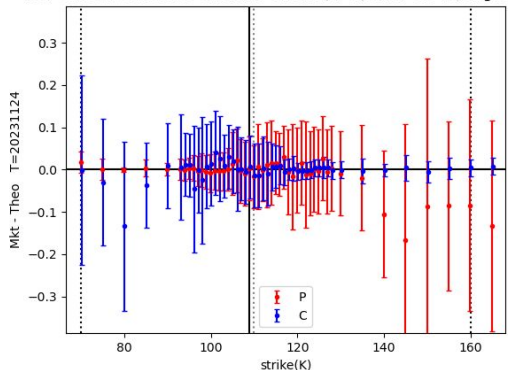
TGT 20231108-153000 C10W: $T=0.0436$, $i=2$, $\chi^2=0.045$, $\text{avgE5}=11.1$



TGT 20231108-153000 C10W: $T=0.0247$, $i=1$, $\chi^2=0.074$, $\text{avgE5}=2.3$



TGT 20231108-153000 C10W: $T=0.0436$, $i=2$, $\chi^2=0.043$, $\text{avgE5}=5.5$

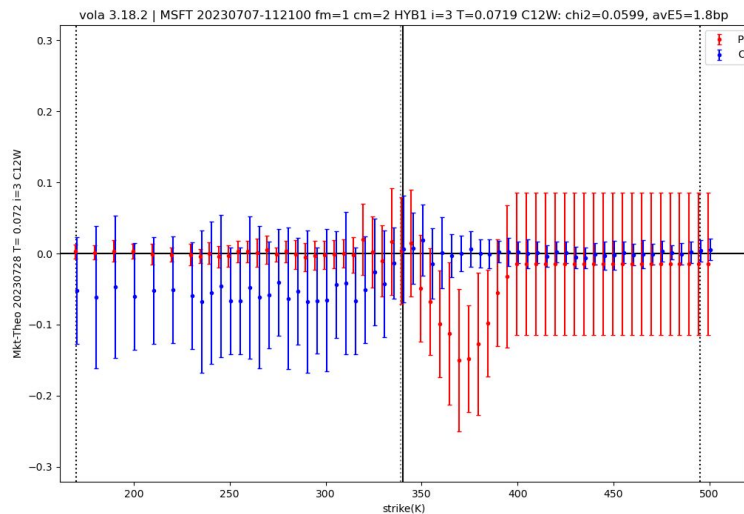


Rate TS and Event Time for American Vanillas

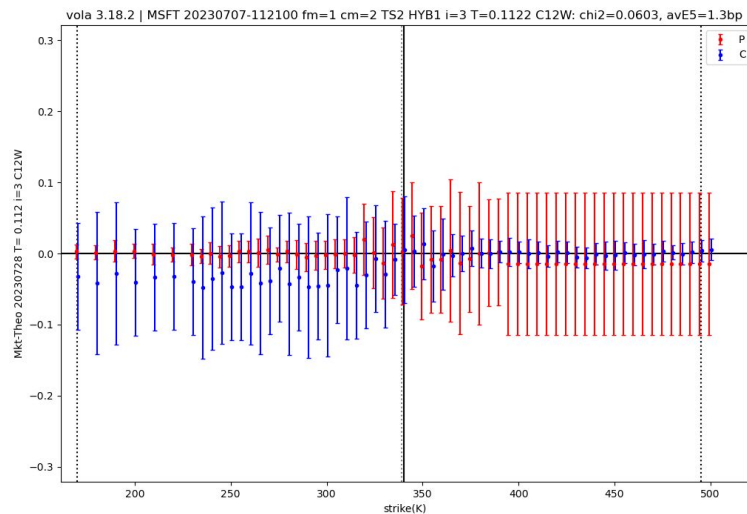
MSFT 2023-07-07

The ultimate test of a valuation approach is always the **price-difference plot**: Mkt - Theo

Flat term rates $r(T)$, $q(T)$



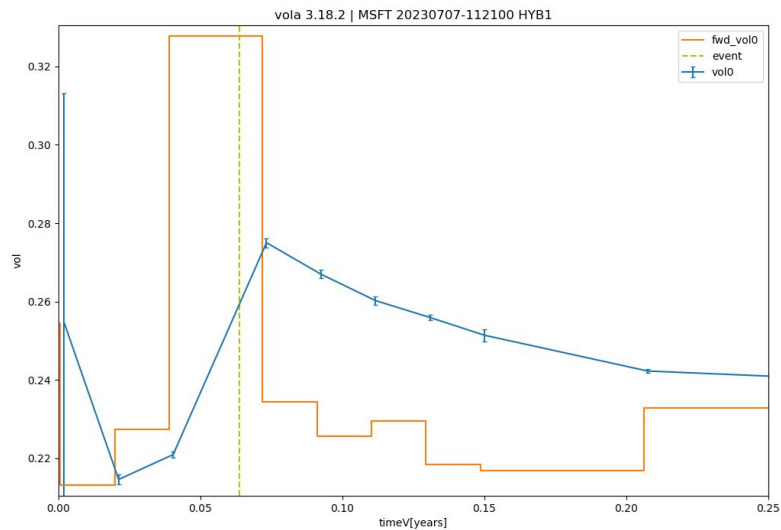
Local $r(t), q(t)$ and $\Delta T_E = 0.04y$



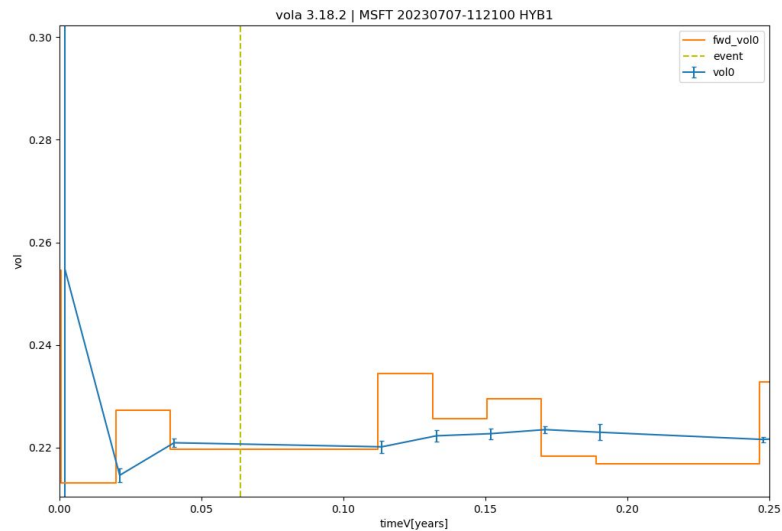
Rate TS and Event Time for American Vanillas

MSFT 2023-07-07

“Dirty” ATF vols

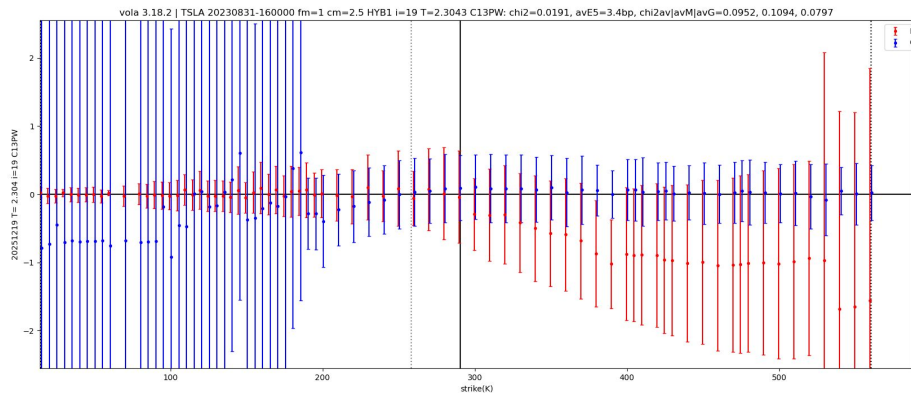


“Clean” ATF vols, $\Delta T_E = 0.04y$



Rate Term-Structure Effect on Pricing American Vanillas

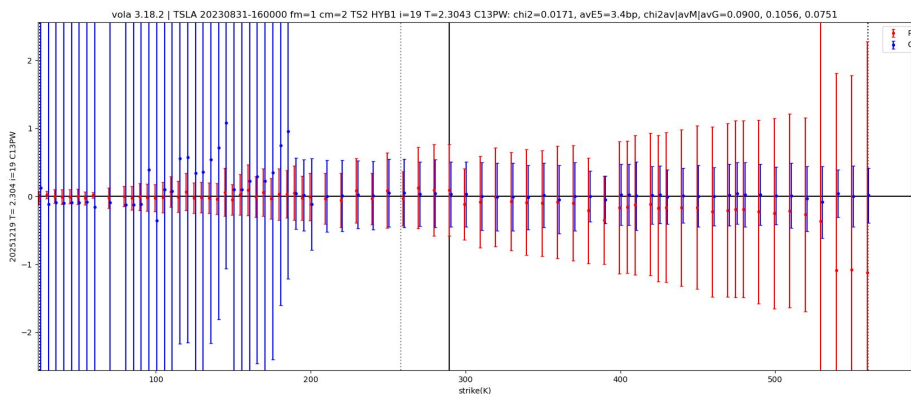
TSLA 2023-08-31



Price-Difference plot: Mkt - Theo

← Pricing with flat term r, q

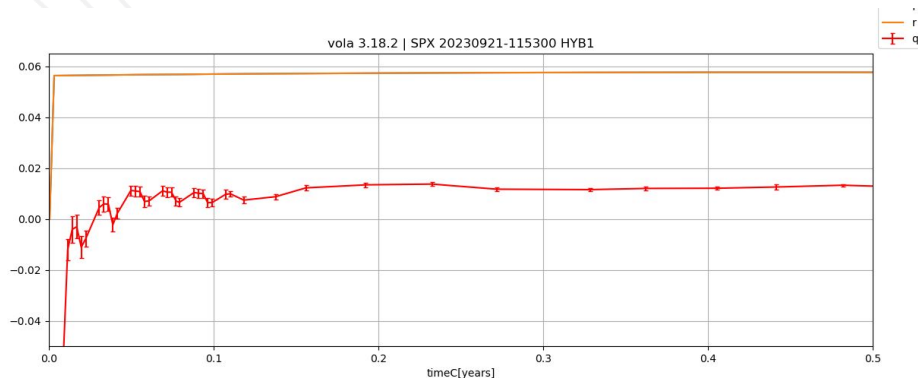
$T = 2.4y$



← Pricing with local $r(t), q(t)$

Settlement Effects for SPX options

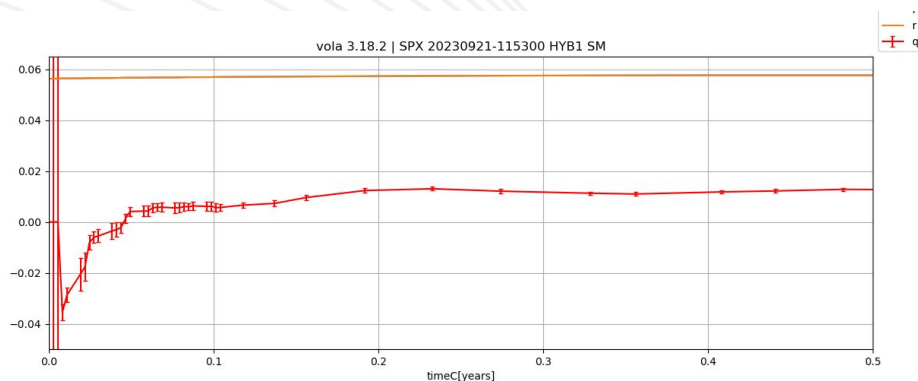
Let's treat SPX like an equity with a "spot", borrow cost, and (perhaps) cash dividends.



Implied borrow cost term structure

← Ignoring settlement, wrong spot

Wrong spot shows up as $1/T$ term in the borrow TS (made up wrong spot for illustration here...).

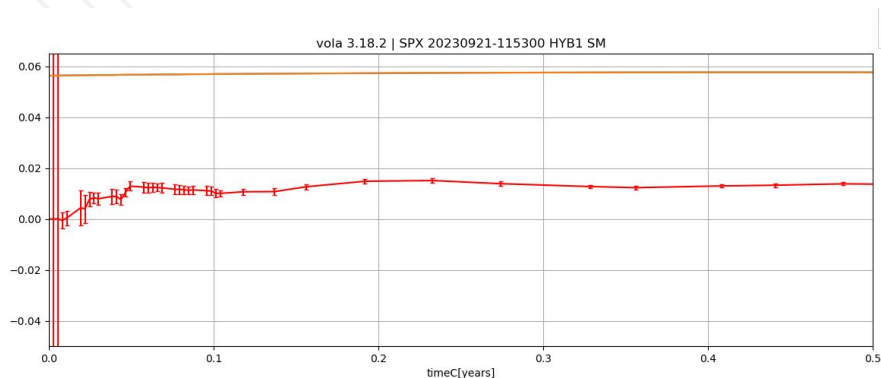


← With settlement, wrong spot

Now short-term borrow TS is smooth.

Settlement Effects for SPX options

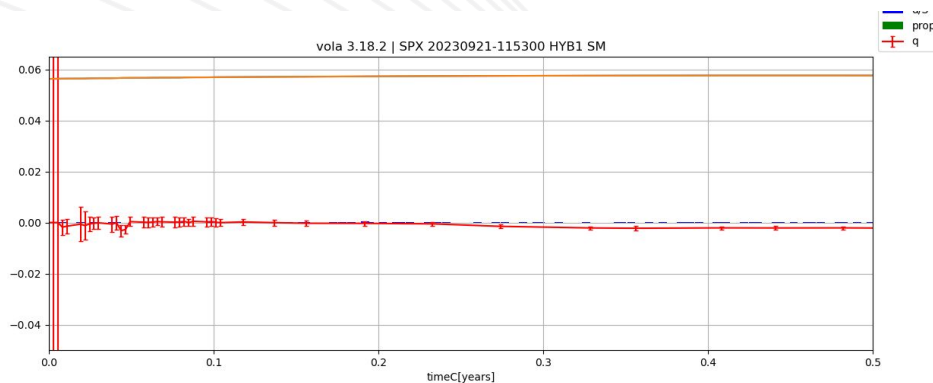
Let's treat SPX like an equity with a "spot", borrow cost, and (perhaps) cash dividends.



Implied borrow cost term structure

← With settlement, implied spot

No divs, so borrow includes div yield



← With settlement, implied spot

With divs, so borrow is "pure" and very flat close to 0

The background of the slide features a series of thin, light gray lines that curve and flow from the top left towards the bottom right, creating a sense of movement and depth.

THE END