# The Economics of Time as it is Embedded in the Prices of Options

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Peter Carr Memorial Conference Tandon School of Engineering New York University • General remarks on additive processes and option pricing.

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- Separating TC and SS for the positive and negative moves.

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• For an underlying Brownian motion the two approaches are equivalent. In general they are different.

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- The limit laws were characterized by Lévy (1937) and Khintchine (1938).
- Separating out the processes for the positive and negative moves and selecting the maximal entropy unit time distribution on the half line given by the gamma distribution one arrives at space scaling a bilateral gamma distribution at unit time.

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- It measures the percentage increase in variance for a percentage increase in the time to maturity.
- We recognize that an additional month at one month is not comparable to an additional month at five years or sixty months.
- The function γ(t) may be approximated from data on option prices with maturities in a neighborhood of a given maturity t.

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- The comparison with 1/2 implies that at the money implied volatilities drop to zero in normal times as maturity drops to zero.
- In stressed times implied volatilities rise towards infinity as we approach zero from above.


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- We observe cases with the elasticity rising or falling monotonically.
- There are also cases with humps.
- The shapes we build into the models allow for at most one interior maximum or minimum but not two such points.

- 신문 문제 전문에



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- The Figures present representative shapes for SS and TC elasticities along with the proportion of 1011 days represented.
- We observe that the time changing elasticities are significant larger than the corresponding space scaling elasticities.



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• We observe from equation that space scaling makes contributions at small levels of t and larger levels of x.

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 X(t) as an additive process can be decomposed in terms of two Lévy processes A, B driven by the time change and space scale respectively

$$A(v) = \int_0^v g(e^u) dL(f'(e^u)e^u)$$
  
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• With X the law at unit time we have

$$X(t) - X = A(\ln t) + B(\ln t)$$

# Space Scaling and perpetual motion

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• Hence the process X is a scaled version of a solution to an OU equation reflecting perpetual motion via the effects on current motion of past shocks.

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• where  $\gamma_g, \gamma_f$  are the time elasticities of g and f.

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- For the choice of a distribution function on the half line consider the exponential for the monotone case and more generally the gamma distribution that will permit the presence of a humped shape.
- This gives us two models for the time elasticity of variance that we designate exponential/gamma time elasticity of variance. The specific functions are

$$\begin{array}{lll} \gamma_{e}(t) & = & b+(a-b)e^{-\gamma t} \\ \gamma_{g}(t) & = & a+\frac{(b-a)c^{\gamma}}{\Gamma(\gamma)}\int_{0}^{t}s^{\gamma-1}e^{-cs}ds \end{array}$$

• The specific time change functions  $f_e(t)$  and  $f_g(t)$  are given by

$$\begin{aligned} f_e(t) &= t^b \exp((b-a) \left(expint(\gamma t) - expint(\gamma)\right) \\ f_g(t) &= t^a \exp\left(\left(a-b\right) \left[\begin{array}{c} \frac{c^{\gamma} {}_2 F_2(\gamma,\gamma;\gamma+1,\gamma+1;-c)}{\gamma^2 \Gamma(\gamma)} \\ -\frac{(ct)^{\gamma} {}_2 F_2(\gamma,\gamma;\gamma+1,\gamma+1;-ct)}{\gamma^2 \Gamma(\gamma)} \end{array}\right] \right) \end{aligned}$$

### Bilateral Gamma Details

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- For scale parameters b<sub>p</sub>, b<sub>n</sub> and speed parameters c<sub>p</sub>, c<sub>n</sub> we may write the bilateral gamma Lévy process L<sub>BG</sub> = (L<sub>BG</sub>(t), t ≥ 0) as

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• The characteristic function for the bilateral gamma is

$$\begin{split} \phi_{BG}(u,t) &= E\left[\exp(iuL_{BG}(t))\right] \\ &= \left(\frac{1}{1-iub_p}\right)^{c_p t} \left(\frac{1}{1+iub_n}\right)^{c_n t} \end{split}$$

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• The Lévy density is given by

$$k_{BG}(x) = c_n \frac{\exp\left(-\frac{|x|}{b_n}\right)}{|x|} \mathbf{1}_{x<0} + c_p \frac{\exp\left(-\frac{x}{b_p}\right)}{x} \mathbf{1}_{x>0}$$

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$$d = b_{p}c_{p} - b_{n}c_{n}$$

$$v = \sqrt{b_{p}^{2}c_{p} + b_{n}^{2}c_{n}}$$

$$s = 2\frac{b_{p}^{3}c_{p} - b_{n}^{3}c_{n}}{v^{3}}$$

$$k = 3 + 6\frac{b_{p}^{4}c_{p} + b_{n}^{4}c_{n}}{v^{4}}$$

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- Figure presents the ratio of the terminal elasticity to the initial elasticity.

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- The fit was conducted on around 15 maturities that included the first five traded maturities, the last five traded maturities and five maturities selected in the intermediate range. The median number of options was 1345 with an interquartile range of between 1135 to 1585.
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- We filtered out values of  $\gamma$  below 0.05 and above 5 for in these cases the term structure for the elasticity of variance is flat.
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- First we note that the time change elasticity is mostly increasing as is evidenced by the ratio of terminal to initial elasticities presented in Figure



## Space Scaling Exponential Elasticities

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- Figure presents the ration of terminal to initial space scale elasticities where the terminal elasticity is above 0.01.

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- In this case we estimated the parameters every five days for a total number of cases of 203.
- The median average percentage error was 0.0237 with an interquartile range from 0.021 to 0.031.
- In 103 of the 203 cases both humps were between a quarter and a year and a half.

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- We learn from these estimations that space scaling plays an important role that is effective at the lower maturities while at the back end it is time change elasticities that dominate.
- The richer term structure of the gamma based case makes effective contributions in the modeling of the time elasticities of variance.

루아지 같은 전문가

# Result on splitting the positive and negative sides at the short end

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- We observe that the up variance elasticities are substantially lower than the down elasticities.

# Table 1Positive and Negative MoveVariance ElasticitiesPercentilePositiveNegative250.18280.9808500.33081.1592750.48261.3314

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- With regard to the space scaling elasticities of variance we have backwardation on the positive side just 30 percent of the time while on the negative side there is backwardation 79 percent of the time.

. 신문 지원 물건 신문 문제 문제

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- Results for both cases are presented when they are used for just a time change.
- Space scaling is then combined with time changing to make a significant improvement.

레이지 한국 문제 전문이다.

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- The two processes are termed the space scaled and time change components and their relative contributions, space to time are determined to be twice the ratio of their elasticities of variance.

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