

# Option Pricing Beyond Black-Scholes Based on Double-Fractional Diffusion

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# Introduction

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# Introduction

- In finance are traded many **derivatives** - assets depending on some underlying assets
- Their price should be derived from the possible scenarios of underlying assets
- First option pricing model (**Black and Scholes**) was based on ordinary Brownian motion - 1973
- 1997 - Nobel prize in economics (Scholes, Merton)
- In times of financial crises, the model cannot catch the complex behavior of financial markets - large drops, sudden shocks
- These “black swans” can be better described by **Lévy distributions** and **(double)-fractional diffusion**

# Option pricing

- *option* is a special asset which gives to the owner the right (**option**) to buy (**call**) or sell (**put**) an underlying asset for specified **strike price**  $K$ .
- buyer - **long position**, seller - **short position**
- seller takes the risk of losses - this is compensated by the **option price**
- Price of a call option at *maturity time* ( $t = T$ ):

$$C(S, K) = \max\{S - K, 0\}$$

(if  $S < K$  we can directly buy the underlying asset for price  $S$ )

- for  $t < T$  we have

$$C(S_t, K, t) = e^{-r(T-t)} E[C(S, K) | \mathcal{F}_t] = \int_{\mathbb{R}} dy \max\left\{S_t e^{(t-T)(r+\mu)+y} - K, 0\right\} g(y, T-t)$$

- $g(y, \tau)$  is the probability distribution given by an appropriate stochastic model



# Mathematical description of Double-fractional diffusion model

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# Stable distributions

- *Stable Hamiltonian* (logarithm of a characteristic function)

$$H_{\alpha,\beta}(p) = \ln \int_{\mathbb{R}} e^{ipx} L_{\alpha,\beta}(x) dx = \\ i\bar{\sigma}p - \bar{\sigma}^{\alpha}|p|^{\alpha} (1 - i\beta \text{sign}(p)\omega(p, \alpha))$$

where  $\alpha \in (0, 2]$  - stability par.,  $\beta = [-1, 1]$  - asymmetry par.,  
 $\sigma > 0$  - scale par.,  $\bar{x} \in \mathbb{R}$  - location par.

- for  $\alpha < 2$  is decays **polynomially** as  $1/|x|^{\alpha+1}$ , except for extreme cases  $\beta = \pm 1$ , where an **exponential** decay is observed for left, resp. right tail.
- stable distributions with  $\beta = -1$  are preferred for description of log-Lévy process  $Y = e^{L_{\alpha,-1}}$ , because all moments exist and are finite (= Laplace transform exists)

# Double-fractional diffusion

- We consider a double-fractional diffusion equation

$$\left( {}^K\partial_t^\gamma + \sigma^\alpha \sec\left(\frac{\pi\alpha}{2}\right) \mathfrak{D}_x^\alpha \right) g(x, t) = 0$$

- $\mathfrak{D}_x^\alpha$  - Riesz-Feller derivative,  ${}^K\partial_t^\gamma$  - Caputo/RF derivative,  $\alpha \in [1, 2]$ ,  $\gamma \in (0, \alpha]$ .
- $\gamma = 1$  - (spatially) fractional diffusion - solution: **stable distribution**  
 $L_\alpha(x, t)$
- for  $\gamma \leq 1$  we need one initial condition  $g(x, 0) = \delta(x)$   
for  $\gamma \in (1, 2]$  we have another condition  $\frac{\partial g}{\partial t}(x, t)|_{t=0} \equiv 0$ .

# Solution of double-fractional diffusion equation

- DFDE in **Fourier-Laplace** image ( $x \xrightarrow{\mathcal{F}} p, t \xrightarrow{\mathcal{L}} s$ )

$$(s^\gamma - H_{\alpha,-1}(p))\hat{\hat{g}}(p,s) = s^{\gamma-\kappa}$$

where  $\kappa = \gamma$  for RF derivative,  $\kappa = 1$  for Caputo derivative

- Mellin-Barnes** representation of  $g(x, t)$ :

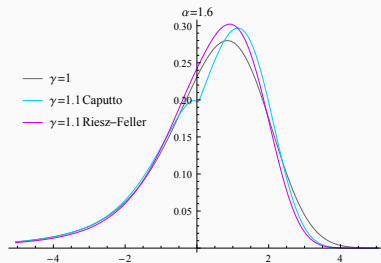
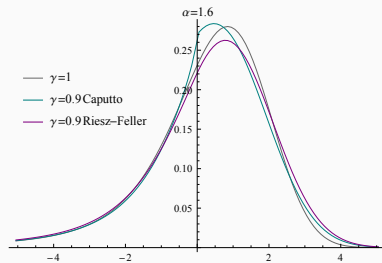
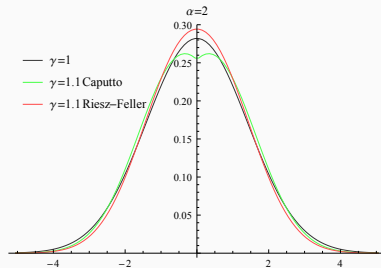
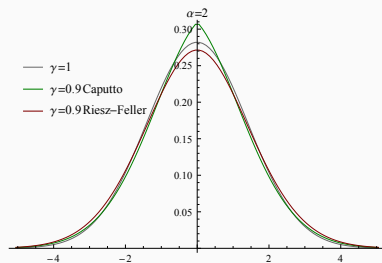
$$g^{DF}(x, t) = \frac{\Gamma(\kappa)}{2\alpha\pi i x} \int_{c-i\infty}^{c+i\infty} \frac{\Gamma\left(\frac{s}{\alpha}\right) \Gamma\left(1 - \frac{s}{\alpha}\right) \Gamma(1-s)}{\Gamma\left(\kappa - \frac{\gamma}{\alpha}s\right) \Gamma\left(\frac{(\alpha-\theta)s}{2\alpha}\right) \Gamma\left(1 - \frac{(\alpha-\theta)s}{2\alpha}\right)} \left[ \frac{x}{(-\mu t^\gamma)^{1/\alpha}} \right]^s ds.$$

- for  $\gamma < 1$  it is possible to derive a **composition rule**, so the solution can be expressed as

$$g(x, t) = \int_0^\infty dl g_\gamma(t, l) L_\alpha(l, x)$$

where  $L_\alpha(l, x)$  is a stable distribution obtained from spatial fractional diffusion equation and  $g_\gamma(t, l)$  is a smearing kernel

# Graphs of double-fractional Green functions



# Applications of double-fractional diffusion to option pricing

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# Double-fractional option pricing

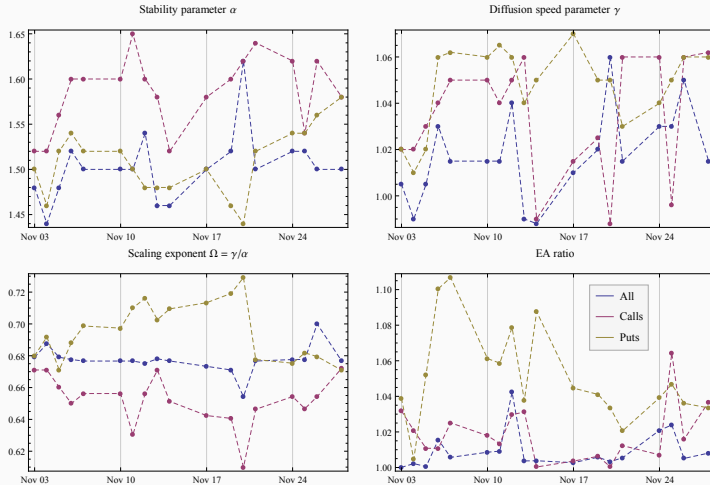
- We fit the model with the option prices of S&P 500 in November 2008 ( $\sim 10^5$  records)
- We minimize aggregated error  $AE = \sum_{t,K} |\mathcal{O}_{model} - \mathcal{O}_{market}|$
- We compare Black-Scholes, Lévy-stable and Double-fractional model
- The parameter  $\gamma$  fluctuates from fast-diffusion mode ( $\gamma > 1$ ) to slow-diffusion model ( $\gamma < 1$ )

# Model calibration for S&P 500 options traded in November 2008

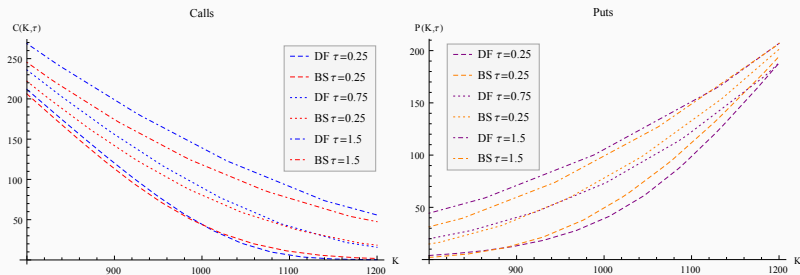
All options			
parameter	Black-Scholes	Lévy stable	Double-fractional
$\sigma$	0.1696(0.027)	0.140(0.021)	0.143(0.030)
$\alpha$	-	1.493(0.028)	1.503(0.037)
$\gamma$	-	-	1.017(0.019)
agg. error	8240(638)	6994(545)	6931(553)
Call options			
parameter	Black-Scholes	Lévy stable	Double-fractional
$\sigma$	0.140(0.021)	0.118(0.026)	0.137(0.020)
$\alpha$	-	1.563(0.041)	1.585(0.038)
$\gamma$	-	-	1.034(0.024)
agg. error	3882(807)	3610(812)	3550(828)
Put options			
parameter	Black-Scholes	Lévy stable	Double-fractional
$\sigma$	0.193(0.039)	0.163(0.034)	0.163(0.037)
$\alpha$	-	1.493(0.031)	1.508(0.036)
$\gamma$	-	-	1.047(0.017)
agg. error	3741(711)	3114(591)	2968(594)



# Estimated parameters day by day and aggregated error



# Estimated call and put option prices for various maturity times



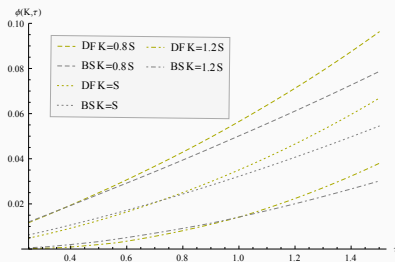
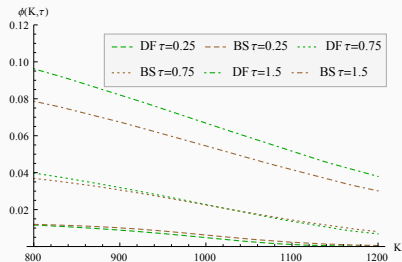
The options are generally not more expensive, the model only redistributes the risk

# Optimal hedging strategies

- the risk coming from selling an option can be eliminated by appropriate **hedging strategy**
- we create a portfolio  $\Pi(S, t) = C(S, t) - \phi(S, t)S(t)$  containing a short of the option and a fraction  $\phi(S, t)$  of the underlying asset  $S(t)$  used to hedge the option.
- optimal strategy  $\phi^*(S, t)$  can be expressed as

$$\phi^*(S, t) = \frac{1}{\sigma^2} \int_{\mathbb{R}} dS(S_{t_0} - S_t) \max\{S_t - K, 0\} g(S, T|S_t, t)$$

# Optimal hedging strategies



# Conclusions

- we have introduced a new model for option pricing based on double-fractional diffusion
- the model outperforms Black-Scholes model and also slightly Lévy-stable model, especially for separate put/call options
- we observe the transition between composite slow diffusion model to complex fast diffusion model
- further analysis and comparison with “regime-switching” models can possibly reveal new important results
- H. Kleinert, J. Korbel. Option Pricing Beyond Black-Scholes Based on Double-Fractional Diffusion. *Physica A* **449** (2016), 200-214.

Thank you for your attention.