#### Risk-Neutral Options Pricing, Implied Distribution of CEZ

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#### MODERNÍ NÁSTROJE PRO FINANČNÍ ANALÝZU A MODELOVÁNÍ

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# Derivation of Risk-Neutral Density

Binomial Tree Continuous World

Derivatives pricing in action

Implied Distribution of CEZ Volatility Smile Implied Distribution

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Binomial Tree Continuous World

#### **Real World**

- Real world  $\rightarrow \mathbb{P}$  measure
- Constant grow rate  $\mu$
- Constant noise σ
- All jumps equally likely  $\rightarrow p = \frac{1}{2}$
- Irrelevant for correct pricing



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Binomial Tree Continuous World

#### **Risk-Neutral World**

- Goal: finding measure Q under which the process of discounted stock {B<sub>t</sub><sup>-1</sup> S<sub>t</sub>, t ≥ 0} is a martingale
  New measure: q<sub>t</sub> = S<sub>t</sub> exp(rδt-S<sup>down</sup><sub>t+δt</sub>)/S<sup>upp</sup><sub>t+δt</sub>-S<sup>down</sup><sub>t+δt</sub>)
- Stock value  $\rightarrow S_t = S_0 e^{\left(\mu + \sigma \sqrt{t} \left(\frac{2X_n n}{\sqrt{n}}\right)\right)}$
- $X_n \rightarrow$  number of up-jumps, binomially distributed

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Binomial Tree Continuous World

#### **Continuous World**

- Transition from discrete to continuous time
- ▶  $\delta t \rightarrow 0, n \rightarrow \infty$
- Applying central limit theorem
- S<sub>t</sub> log-normally distributed under  $\mathbb{Q}$

$$\bullet S_t = S_0 e^{\left(\left(r - \frac{1}{2}\sigma^2\right)t + \sigma\sqrt{t}Z\right)}$$

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#### **General Pricing Formula**

- General pricing formula:  $V_0 = E_{\mathbb{Q}} \left( B_T^{-1} X \right)$
- Goal: determining density of discounted claim X
- Transformation of random variable S<sub>T</sub>
- Using MATLAB Symbolic Toolbox

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# **Call Option**

European call: right, but not obligation, to buy the stock at specified price (strike) at time t = T

• Claim: 
$$X = (S_T - k)^+$$

• Option value:  $V(S_0, T) = B_T^{-1} \int_0^\infty x f(x) dx$ 



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#### Put Option

European put: right, but not obligation, to sell the stock at specified price (strike) at time t = T

• Claim: 
$$X = (k - S_T)^+$$

• Value:  $V(S_0, T) = B_T^{-1} \int_0^\infty x f(x) dx$ 



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#### Arbitrary Derivative

European style

• Claim: 
$$X = min\left\{max\left\{1.3S_0, 0.9\frac{S_T}{S_0}\right\}, 1.8S_0\right\}$$

Numerical integration



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Volatility Smile Implied Distribution

# Volatility Smile

- Implied or historical volatility used in pricing formulas
- Implied volatility is unobservable variable
- Nonlognormality can be often observed in the market
- Volatility smiles are used to allow for nonlognormality
- Volatility: function of strike and time to maturity

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Volatility Smile Implied Distribution

### Volatility Smile on CEZ call

- Call warrants on CEZ stock traded on Boerse Stuttgart denominated in EUR as of 30 April 2009 used
- American exercising style
- Dividend paying



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Volatility Smile Implied Distribution

#### Implied Volatility

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$$V_0 = k\omega_1(\delta_k) - S_0\omega_2(\delta_{S_0})$$

$$\begin{split} \omega_{1}\left(\delta_{k}\right) &= e^{-\delta_{1}\Delta_{1}}N_{1}\left(d_{1}\left(\frac{P_{e}-\delta\Delta_{1}}{P_{1}^{*}}\right)\right) + \\ &+ e^{-\delta_{1}z\Delta_{1}}N_{2}\left(-d_{1}\left(\frac{P_{e}-\delta\Delta_{1}}{P_{1}^{*}}\right), d_{1}\left(\frac{P_{e}-\delta_{2}\Delta_{1}}{P_{2}^{*}}\right); -\sqrt{\frac{\tau_{1}}{\tau}}\right) + \ldots + \\ &+ e^{-\delta_{1}\tau\Delta_{1}}N_{n}\left(-d_{1}\left(\frac{P_{e}-\delta\Delta_{1}}{P_{1}^{*}}\right), \ldots, -d_{1}\left(\frac{P_{e}-\delta(n-1)\Delta_{1}}{P_{n-1}^{*}}\right), d_{1}\left(P_{e}-\delta\tau\right); \Omega_{n}\right) \end{split}$$

$$\begin{split} P_{i}^{*} \left[ e^{-\delta_{i}\Delta_{i}}N_{i}\left(d_{i}\left(\frac{\rho^{*}e^{-\delta\Delta_{i}}}{\rho^{*}}\right)\right) + e^{-\delta_{i}z\Delta_{i}}N_{2}\left(-d_{i}\left(\frac{\rho^{*}e^{-\delta\Delta_{i}}}{\rho^{*}}\right), d_{i}\left(P_{i}^{*}e^{-\delta_{2}\Delta_{i}}\right) : -\sqrt{\frac{L}{T}}\right) \right] - \\ - \left[ e^{-\delta_{i}\Delta_{i}}N_{i}\left(d_{2}\left(\frac{\rho^{*}e^{-\delta\Delta_{i}}}{\rho^{*}}\right)\right) + e^{-\delta_{i}z\Delta_{i}}N_{2}\left(-d_{2}\left(\frac{\rho^{*}e^{-\delta\Delta_{i}}}{\rho^{*}}\right), d_{2}\left(P_{i}^{*}e^{-\delta_{2}\Delta_{i}}\right) : -\sqrt{\frac{L}{T}}\right) \right] \\ = P_{i}^{*} - 1, \end{split}$$

$$d_{i}(G) = \left(\frac{ln(G) + \frac{\sigma^{2}\tau}{2}}{\sqrt{\sigma^{2}\tau}}\right)$$

see [P. Carr, "The Valuation of American Exchange Options with Application to Real Options"] for details

Volatility Smile Implied Distribution

# Implied Distribution

- Derived from the market prices of warrants
- Two-lognormal mixture distribution used
- Minimisation problem → find parameters of two-lognormal mixture so that the difference between observed prices and implied prices is minimal.
- Trading volume used as weights
- Problem: resulting distribution fulfills the definition of density (integrated to one)
- To avoid arbitrage opportunities: mean of implied distribution must be equal to forward price of CEZ
- KNITRO third-party libraries and MATLAB Optimization Toolbox used

Volatility Smile Implied Distribution

#### Implied Density of CEZ

Implied density of CEZ for set of times to maturity \(\tau\)













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Volatility Smile Implied Distribution

#### **Observed vs Implied Option Prices**

Observed vs implied prices by two-lognormal mixture



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#### What for?

- Pricing the options on CEZ not traded on the market
- Searching for mispriced options
- Problem: bid-offer spread

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# Thank you

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