

# **American basket and spread options with a simple binomial tree**

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**Bachelier congress, Toronto, June 22-26, 2010**

# Motivation

- Commodity, currency baskets consist of two or more assets, contain short positions (e.g., crack or crush spreads)
- Basket options are often American-style (or Asian-style)
- The valuation and hedging of basket options is challenging even in the Black-Scholes framework, because  
*the sum of lognormal r.v.'s is not lognormal.*
- Spreads can have negative values and negatively skewed distribution, so *lognormal distribution cannot be used, even in approximation.*
- Existing approaches can only deal with baskets with positive weights or spreads between *two assets*.
- Numerical and Monte Carlo methods are slow and do not provide closed formulae for option price or greeks.

# American basket options

## **Additional difficulties** for American options:

- No closed form solution, truly path-dependent option
- Most common method: binomial tree (Cox Ross & Rubinstein'79)
- Monte-Carlo: not feasible, solution: Longstaff & Schwartz'01

## **Multi-asset situation:**

- Binomial tree replaced by "binomial pyramid"  
→ computationally not feasible for #assets > 2
- Implied binomial tree (Rubinstein): only positive weights
- Longstaff & Schwartz: involves complicated Hermite polynomials, can be slow

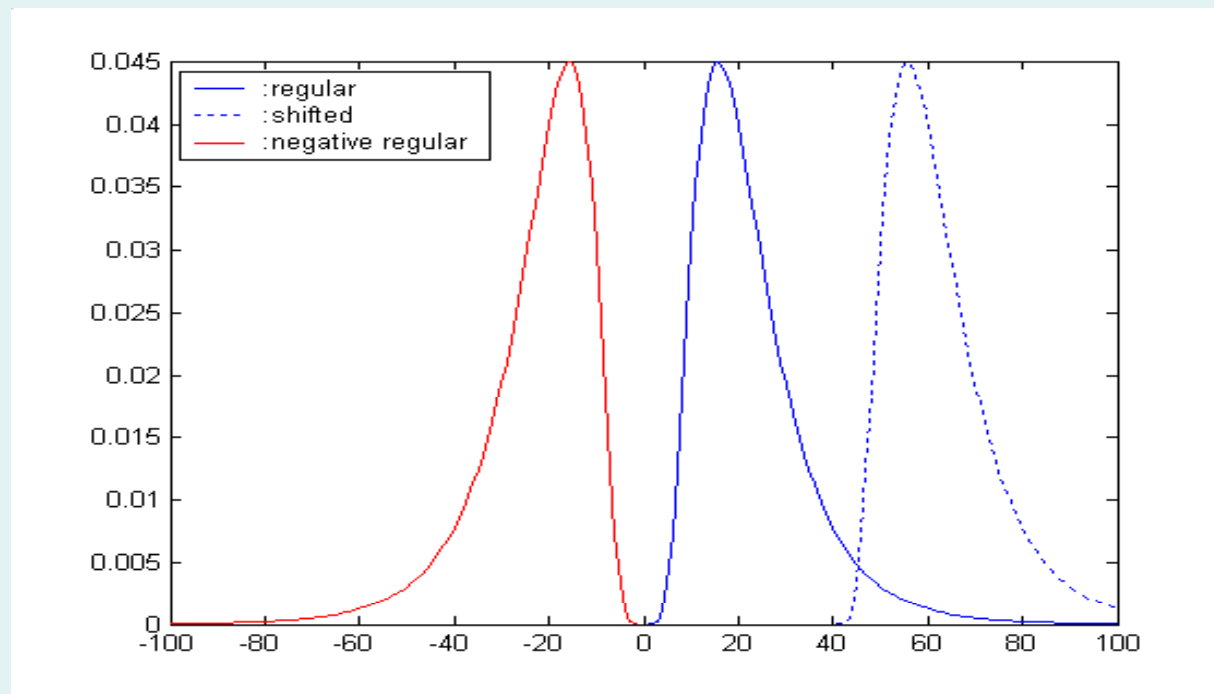
# GLN approach (Borovkova et al.'07)

- Essentially a *moment-matching method*, in the spirit of the Wakeman method for Asian options (Turnbull and Wakeman (1991)).
- Based on old and fundamental research on the good quality of approximation the sum of lognormal r.v.'s by a lognormal distribution (e.g., Mitchell (1968)).
- Basket distribution is approximated using a *generalized family of lognormal distributions*: shifted and negative shifted lognormals

## The main attractions:

- applicable to baskets with several assets and negative weights
- Easily extended to Asian-style options (and now also to American options!)
- Allows to directly apply Black-Scholes formula (in European case)
- Provides closed form formulae for the option price and the greeks (approximate, European and Asian cases)
- Provides the way to build one binomial tree for the whole basket price process

# Lognormal vs shifted and negative lognormal: two-parameter vs. three-parameter distribution



## Assumptions

- Basket of *futures* on related commodities or currencies.
- The basket value at time of maturity  $T$

$$B(T) = \sum_{i=1}^N a_i F_i(T)$$

where  $a_i$  : the weight of asset (futures contract)  $i, a_i < or > 0$   
 $N$  : the number of assets in the portfolio,  
 $F_i(T)$  : the futures price  $i$  at the time of maturity .

- The futures in the basket and the basket option mature on the same date.

# Individual assets' dynamics

Under the risk adjusted probability measure  $Q$ , the futures prices are martingales. The stochastic differential equations for  $F_i(t)$  is

$$\frac{dF_i(t)}{F_i(t)} = \sigma_i dW_i(t), i = 1, 2, 3, \dots, N$$

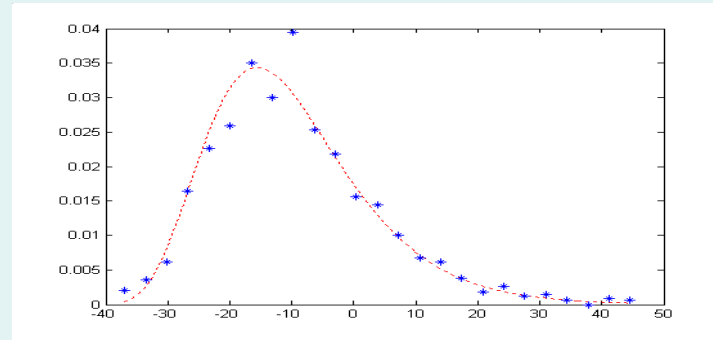
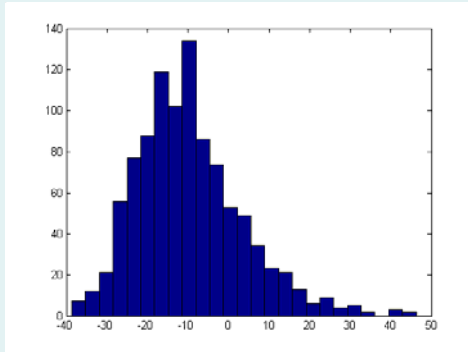
where

$F_i(t)$  : the futures price  $i$  at time  $t$

$\sigma_i$  : the volatility of asset  $i$

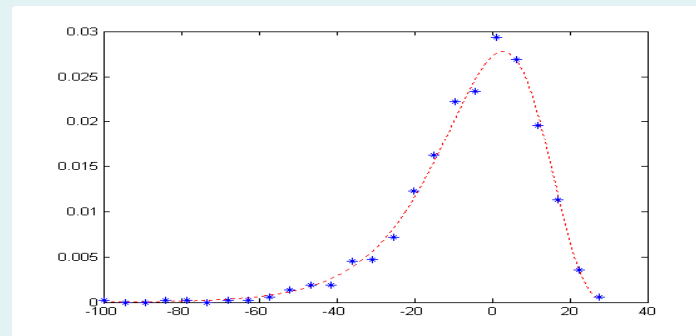
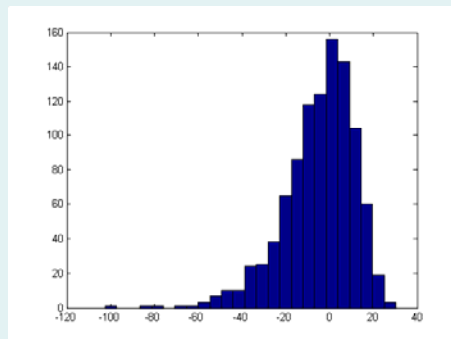
$W_i(t), W_j(t)$  : the Brownian motions driving assets  $i$  and  $j$  with correlation  $\rho_{i,j}$  ( $dW_i dW_j = \rho_{i,j} dt$ )

# Examples of basket value distribution:



*Shifted lognormal,  $\tau < 0$*

$Fo = [100;90]; \sigma = [0.2;0.3]; a = [-1;1]; X = -10; r = 3\%; T = 1 \text{ year}; \rho = 0.9$



*Negative shifted lognormal,  $\tau > 0$*

$Fo = [105;100]; \sigma = [0.3;0.2]; a = [-1;1]; X = -5; r = 3\%; T = 1 \text{ year}; \rho = 0.9$



# Moment matching

The first three moments and the skewness of basket distribution:

$$E B(t) = M_1(t) = \sum_{i=1}^N a_i F_i(0)$$

$$E (B(t))^2 = M_2(t) = \sum_{j=1}^N \sum_{i=1}^N a_i a_j F_i(0) F_j(0) \exp(\rho_{i,j} \sigma_i \sigma_j t)$$

$$E (B(t))^3 = M_3(t) =$$

$$= \sum_{k=1}^N \sum_{j=1}^N \sum_{i=1}^N a_i a_j a_k F_i(0) F_j(0) F_k(0) \exp(\rho_{i,j} \sigma_i \sigma_j t + \rho_{i,k} \sigma_i \sigma_k t + \rho_{j,k} \sigma_j \sigma_k t)$$

$$\eta_{B(t)} = \frac{E(B(t) - E(B(t)))^3}{\sigma_{B(t)}^3}$$

where  $\sigma_{B(t)}$  : standard deviation of basket at the time  $t$

- If we assume the distribution of a basket  $B(t)$  is shifted lognormal with parameters  $m = m(t), s = s(t), \tau = \tau(t)$  the parameters should satisfy non-linear equation system :

$$M_1 = \exp\left(m + \frac{1}{2}s^2\right)$$

$$M_2 = \tau^2 + 2\tau \exp\left(m + \frac{1}{2}s^2\right) + \exp(2m + 2s^2)$$

$$M_3 = \tau^3 + 3\tau^2 \exp\left(m + \frac{1}{2}s^2\right) + 3\tau \exp(2m + 2s^2) + \exp\left(3m + \frac{9}{2}s^2\right)$$

(we omitted dependence of the moments and parameters on  $t$ )

- If we assume the distribution of a basket is negative shifted lognormal, the parameters should satisfy non-linear equation system above by changing  $M_1$  to  $-M_1$  and  $M_3$  to  $-M_3$
- NB: For basket *of futures*, we have an important simplification: zero drift implies *two unknown parameters* and not three  
 → system of two equations can be solved explicitly → much better distribution matching !

## Approximating distribution

Skewness	$\eta_t > 0$			$\eta_t < 0$
Approximating distribution	<b><i>Shifted lognormal</i></b>			<b><i>Negative shifted lognormal</i></b>

Note: we never use regular lognormal distribution as shifted lognormal always provides a better approximation  
(improvement over Wakeman method for Asian and basket options)

Skewness sign remains the same throughout option's lifetime,  
increases in absolute value as  $t \rightarrow T$

## GLN approach for American options

- Need to approximate not just the *terminal basket distribution* by GLN, but the entire ***basket value process*** from time 0 to maturity by a GBM
- For this, we replace our original basket  $B$  by  $B^*(t) = B(t) - \tau(t)$  or  $-B(t) - \tau(t)$  depending on the sign of skewness.

Note:  $B^{(*)}(t)$  is lognormal with parameters  $(m(t), s(t))$  if  $B(t)$  is GLN  $(m(t), s(t), \tau(t))$

(This is similar to displaced diffusions (M.Rubinstein, JF 1983))

So we can assume that  $B^{(*)}(t)$  follows GBM with parameters  $(\mu^*, \sigma^*)$  given by

$$\sigma^{*2} = \frac{s^2(t)}{t} \quad \text{and} \quad \mu^* = \frac{m(t) - \log B^*(0)}{t} + \frac{1}{2} \sigma^{*2} (= 0 \text{ for futures})$$

- Parameters  $(\sigma^*, \tau)$  are determined via matching the second and third central moments
- NO numerical solution is required, just solve simple two equations, two unknowns system
- Skewness near zero: Bachelier model (normal distribution rather than lognormal)

## Parameters $\sigma^*, \tau$ : an example

*Basket :*

$F_0 = [100; 120]; \sigma = [0.2; 0.3];$

$a = [-1; 1]$

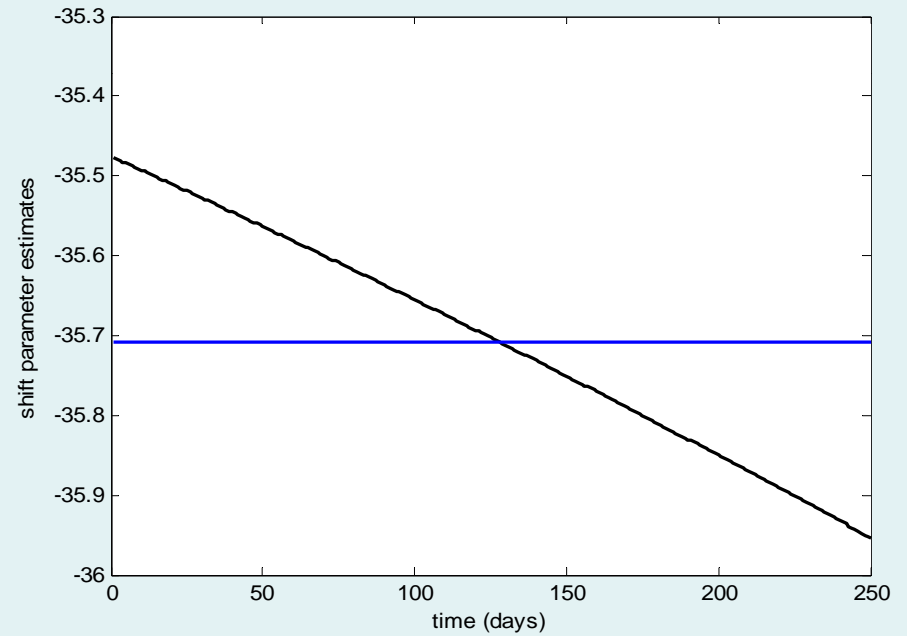
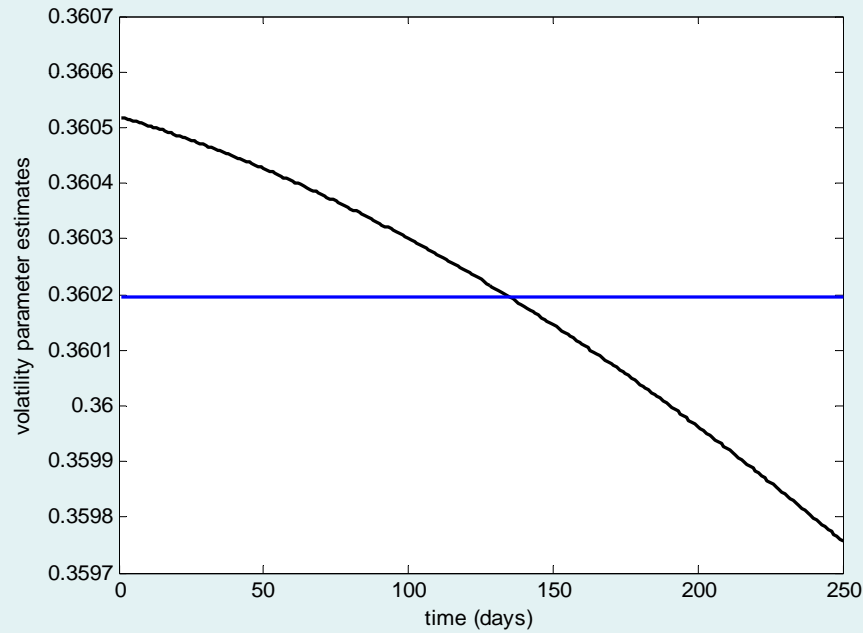
$\rho = 0.9;$

$T = 1 \text{ year}$

for all  $t$ :  $\eta(t) > 0, \tau(t) < 0$

shifted lognormal approximation

Note: both parameters almost constant



## Algorithm for building the binomial tree

- Build the binomial tree for the value  $B^*(t)$  which follows GBM:
- At each time step on the tree, the value  $B^*$  moves either up to  $uB^*$  with probability  $q$  or down to  $dB^*$  with probability  $1 - q$ , where

$$u = \exp((\mu^* - 1/2\sigma^{*2})\Delta t + \sigma^* \sqrt{\Delta t})$$

$$d = \exp((\mu^* - 1/2\sigma^{*2})\Delta t - \sigma^* \sqrt{\Delta t})$$

$$q = (\exp(\mu^* \Delta t) - d) / (u - d)$$

- Translate the obtained binomial tree for  $B^*$  into the tree for  $B$  using  
 $B(t) = B^*(t) + \tau(t)$  for shifted lognormal case, or  
 $B(t) = -B^*(t) - \tau(t)$  for negative shifted lognormal case.

- This tree can be used now for valuing an American (or e.g. Bermudan) option on  $B$ , computing option's delta at each node and deciding on early exercise.

## Simplification: constant shift parameter

- For constant shift parameter  $\tau$ , can directly use the tree built for  $B^*$ :
- For shifted lognormal approximation, recall that  $B^*(t) = B(t) - \tau$
- The payoff of an American call option on  $B$  with the strike price  $K$  is  
the payoff of a American call option on basket  $B^*$  with the strike  $K - \tau$
- For negative shifted lognormal approximation, recall that  $B^*(t) = -B(t) - \tau$
- The payoff of an American call option on  $B$  with strike  $K$  is  
the payoff of a American put option on basket  $B^*$  with the strike  $-\tau - K$
- Both can be evaluated using the tree for  $B^*$

	<i>Basket 1</i>	<i>Basket 2</i>	<i>Basket 3</i>		<i>Basket 4</i>	<i>Basket 5</i>
<i>Futures price</i> ( $F_0$ )	[100;100]	[100;120]	[150;100]		[95;90;105]	[100;90;95]
<i>Volatility</i> ( $\sigma$ )	[0.3;0.2]	[0.2;0.3]	[0.3;0.2]		[0.2;0.3;0.25]	[0.25;0.3;0.2]
<i>Weights</i> ( $a$ )	[0.3;0.7]	[-1;1]	[-1;1]		[1; -0.8; -0.5]	[0.6;0.8; -1]
<i>Correlation</i> ( $\rho$ )	0.6	0.9	0.7		$\rho_{1,2} = \rho_{2,3} = 0.9$ $\rho_{1,3} = 0.8$	$\rho_{1,2} = \rho_{2,3} = 0.9$ $\rho_{1,3} = 0.8$
<i>Strike price</i> ( $X$ )	100	20	-50		-30	40
<i>skewness</i> ( $\eta$ )	$\eta > 0$	$\eta > 0$	$\eta < 0$		$\eta < 0$	$\eta > 0$

T=1 year; r = 5 %



# Simulation results

## ATM put

## OTM put (ATM-10)

<i>Basket</i>	<i>Bin. Pyramid (N=150)</i>	<i>Impl. BT (N=150)</i>	<i>GLN (N=250)</i>	<i>Bin. Pyramid (N=150)</i>	<i>Impl. BT (N=150)</i>	<i>GLN (N=150)</i>
<b>1</b>	7.93	7.94	7.93	3.66	3.67	3.66
<b>2</b>	7.66	-	7.67	3.17	-	3.16
<b>3</b>	13.07	-	13.09	9.37	-	9.39
<b>4</b>	-	-	7.19	-	-	3.94
<b>5</b>	-	-	9.77	-	-	4.72

## Other issues and further research

- **Delta-hedging performance:**
  - analyzed on the basis of Monte Carlo simulations
  - hedge error is in the order of 5-10% of the option price
  - almost the same as the hedge error for a single asset case with matching vol
- Other greeks (especially vegas)
- Quality of *generalized lognormal* approximation → need *theorems similar to those of Mitchell*
- Other applications:
  - *physics*: a wave propagating through a turbulent medium
  - *wireless communication*: attenuation due to shadowing in wireless channels
  - *health sciences*: incubation periods of diseases, e.g., anthrax inhalation
  - *analysis of handwriting*: direction control ~ weighted difference of lognormals
  - *ecology and chemistry*: particle size distribution, pollution