# Pricing exotic path-dependent options The Singular Points method [GZA10; GZ11]

Sudip Sinha Supervisor: Prof. Fabio Antonelli

MathMods Università degli Studi dell'Aquila

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Motivation

Asian options

Cliquet options

Conclusion

# note nodels: introduction

- Assets
  - basic assets

```
riskless deterministic: S_t^0 = e^{rt} risky stochastic process: (S_t)_t
```

- derivatives contracts on other assets (underlying) futures & forwards symmetric risk options asymmetric risk
- Problem: pricing derivatives finding a fair price
- Assumptions
  - ▶ viable / no arbitrage / no free lunch
  - frictionless
  - infinitely divisible assets

# Option types

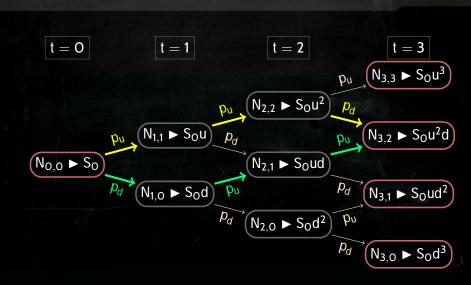
 Simple options - classification of the basis of: exercise time European or American right of owner call or put

#### Example (European call)

payoff:  $h(S_T) = (S_T - K)_+ = max\{S_T - K, 0\}$ , exercise at maturity

Exotic options – usually path-dependent

Asian payoff: function of average of the underlying.
lookback payoff: function of extrema of the underlying.
cliquet A series of globally or locally bounded
at-the-money options.
digital existence depends on pre-set barriers.



### 2015-201 [BS73] model (continuous)

riskless 
$$S_t^0 = e^{rt}$$
 
$$\text{risky } S_t = s_0 e^{(r - \frac{\sigma^2}{2})t + \sigma W_t}$$

Theorem (Convergence of prices from CRR to BS) Prices of basic assets under CRR  $\stackrel{d}{\rightarrow}$  prices of basic assets under BS.

Corollary (Convergence of evaluation formulae)
The previous theorem implies that evaluation formulae under CRR converge in distribution to evaluation formulae for BS.

Approximate BS price by using CRR model.

Quest: Find algorithms with reduced computational complexity.

#### Market models: discrete vs. continuous

Parameter	Discrete	Continuous
Example	[CRR79]	[BS73]
Theoretical complexity	Easy	Hard
Ease of implementation	Hard	Easy
Closed-form formula	No <sup>1</sup>	Yes
Computational complexity	Hard: $O(2^n)^1$	Easy: O(1)
Versatile	Yes	No

<sup>&</sup>lt;sup>1</sup>CRR: backward recursive



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#### Asian options: introduction

Payoff: function of some form of average price.

Average	Discrete	Continuous
AM	$A_n = \frac{1}{n+1} \sum_{i=0}^n S_n$	$A_T = \frac{1}{T} \int_0^T S_t dt$
GM	$G_n = \left(\prod_{i=0}^n S_n\right)^{\frac{1}{n+1}}$	$G_T = exp\left(\frac{1}{T}\int_0^T log(S_t) dt\right)$

Example (fixed-strike Asian call of European type) Given strike-price K, payoff  $= (A_T - K)_+$ , exercised only at maturity.

### Asian option: pre-existing methods

<u>Arithmetic</u>	mean	STEEL STATE OF	
Method	Type	Complex	Remarks
[CRR79]	Tree	O(2 <sup>n</sup> )	simple, accurate, convergence
[HW93]	Tree	$O(n^3)$	accuracy & convergence problems
[BP96]	Tree	$O(n^3)$	accuracy & convergence problems
[Cha+99]	Tree	$O(n^4)$	thin bounds, very large memory
[VecO1]	PDE	$O(n^2)$	not universally applicable
[dFLO5]	PDE		more general than [VecO1]

Geometric mean Closed-form formula exist under BS.

## 2015-10-7 SPM for Asian options: idea

```
N<sub>i,j</sub> Node of the binomial tree
```

 $A_{i,j}$  Average upto  $N_{i,j}$ ,  $\binom{i}{j}$  choices

P<sub>i,j</sub> Option price at N<sub>i,j</sub>

$$\left\{ \left( A_{i,j}^{l}, P_{i,j}^{l} \right) \right\}_{l}$$
 singular points (SPs) – completely characterise price price continuous, convex, piecewise-linear function found

by joining SPs

### SPM for Asian options: start at maturity (i = n)

For  $N_{n,j}$ : calculate  $A_{i,j}^{min}$  and  $A_{i,j}^{max}$ .

#### Singular points:

1. 
$$j \in \{0, n\}: (A, (A - K)_+)$$

$$2. \ j \notin \{0,n\} \ \text{and} \ K \in \left(A_{n,j}^{min},A_{n,j}^{max}\right):$$

**2.1** 
$$(A_{n,j}^{min}, O)$$

2.3 
$$(A_{n,j}^{\text{max}}, A_{n,j}^{\text{max}} - K)$$

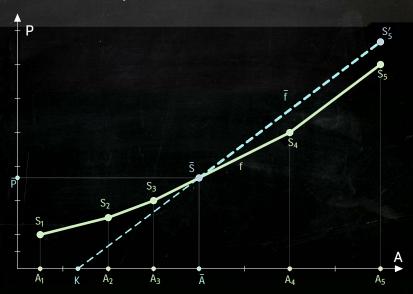
3. 
$$j \notin \{0, n\}$$
 and  $K \notin \left(A_{n,j}^{min}, A_{n,j}^{max}\right)$ :

3.1 
$$\left(A_{n,j}^{min}, (A_{n,j}^{min} - K)_+\right)$$

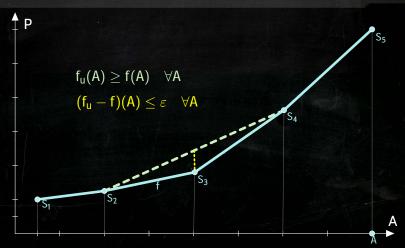
3.2 
$$\left(A_{n,j}^{max}, (A_{n,j}^{max} - K)_{+}\right)$$

### SPM for Asian options: exact price

- Up movement (for N<sub>i,i</sub>): t = i1.  $\forall A_{i+1,j}^l : B^l = \frac{(i+2)A_{i+1,j}^l - S_{i+1,j}}{i+1}$ . Step 2  $\textbf{2.} \ \ \textbf{If} \ \textbf{B}^{\textbf{I}} \in \left[\textbf{A}^{min}_{\textbf{i},\textbf{j}}, \textbf{A}^{max}_{\textbf{i},\textbf{j}}\right] \implies \textbf{B}^{\textbf{I}} \ \textbf{is} \ \textbf{SA}.$ 3. For each SA,  $B_{ij}^{I} = \frac{(i+1)B^{I} + S_{i+1;j+1}}{i+2}$ . 4.  $v_{i,i}(B^l) =$  $\tfrac{1}{R} \left\lceil p_u v_{i+1,j+1} \left( B_u^l \right) + p_d v_{i+1,j} \left( A_{i+1,j}^l \right) \right\rceil.$ Step 1 5.  $(B^I, V_{i,j}(B^I))$  is a SP. down Down movement (for Ni i). Aggregate and sort by SAs.
- Repeat for all j. Iterate backward till i = 0.  $P_{0,0}^1$  is
- the exact binomial price.

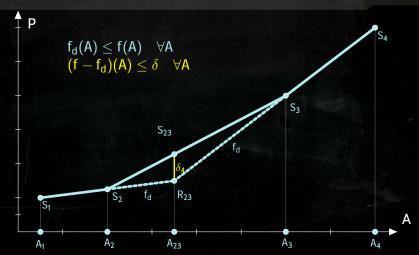


# SPM for Asian options: approximation Upper estimates



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# SPM for Asian options: approximation Lower estimates



### SPM for Asian options: numerical results

Data:  $s_0 = 100, T = 1, r = 0.1, q = 0.03$ .

		K =	90	K =	110
	n	$\sigma = 0.2$	$\sigma = 0.4$	$\sigma = 0.2$	$\sigma = 0.4$
Bin	10	14.5912	17.8033	2.5100	6.6523
DIII	25	15.1535	18.6786	2.6270	7.3451
	10	14.5925	17.8068	2.5090	6.6511
	25	15.1535	18.6785	2.6270	7.3449
CD	50	15.3524	19.0420	2.6673	7.4563
SP	100	15.4732	19.2696	2.6886	7.5174
	200	15.5453	19.4065	2.6996	7.5502
	400	15.5861	19.4845	2.7053	7.5674

### SPM for Asian options: summary

- □ Introduced by Gaudenzi et al [GZA10] in 2010.
- Convergent to exact CRR and thus BS.
- Easily generalised to American case and lookback options.
- Approx: A priori error bounds.
- ☑ Difficult to compute theoretical complexity.
- Depends on the recombinant nature of the underlying's tree.
- Not extensible to GM, since the price function is non-linear.

$$G_u = \left(G^{i+1}S_{i+1,j}\right)^{\frac{1}{i+2}} \propto G^{\frac{i+1}{i+2}}$$

oxdots Constant volatility assumption  $\Longrightarrow$  local volatility models fail.



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#### **Definitions**

forward start option  $\;$  price option today with payoff  $=(S_T-S_u)_+,$   $0 \leq u < T.$ 

cliquet option a series of consecutive at-the-money forward start options, with bounded returns.

#### Pre-existing methods for pricing

- No prominent tree-based method.
- ► [WilO2]: PDE based, FD approach.
- [WFVO6]: PDE based, FD approach; generalisations.

### Cliquet options: terminology

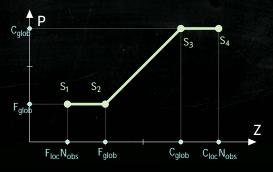
- Observation times: time points at which the forward start options expire. Assumption: equidistant, count = N.
- ► Return:  $R_i = \frac{S_i S_{i-1}}{S_{i-1}} = \frac{S_i}{S_{i-1}} 1$ .
- ▶ Running sum:  $Z_i = \sum_{k=1}^{i} max\{F_{loc}, min\{C_{loc}, R_k\}\}.$
- ▶ Payoff =  $\max\{F_{glob}, \min\{C_{glob}, Z_N\}\}$ .

#### SPM for cliquet options: details

Idea: At the i<sup>th</sup> interval:

- m: number of computational time steps
- 2<sup>m</sup> possible paths; probability binomially distributed.
- Z depends on paths and their probabilities.
- $ightharpoonup (Z,P) \Longrightarrow SP$ , where  $P \Longrightarrow price$ .

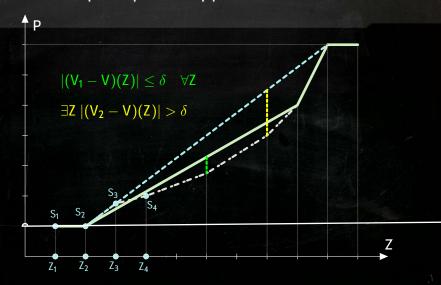
Price function at maturity: piecewise-linear, continuous (not convex).



### SPM for cliquet options: previous times (i < N)

The realizable paths and associated quantities are denoted by primed variables.

- 1. From running sums  $Z_{i+1}^{I}$ , subtract possible returns  $R_{j}^{\ell}$  to get  $B_{I,j}$ .
- 2. If  $B_{l,j} \in [iF_{loc}, iC_{loc}] \implies \text{singular point at time i.}$
- 3. Price function:  $v_i(B_{l,j}) = e^{-\frac{rT}{N}} \sum_{j=0}^{j_0} \left[ p_j^{\ell} v_{i+1}(Z + R_j^{\ell}) \right]$ .
- 4. Linear combination of piecewise-linear continuous functions is piecewise-linear and continuous. Iterate backward.
- 5.  $V_0(B_{0,0})$  is the exact binomial price.



#### SPM for cliquet options: numerical results

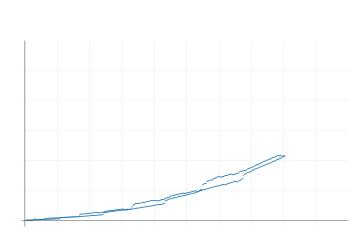
#### Data

$$ightharpoonup$$
  $F_{loc} = O, C_{loc} = O.08, F_{glob} = O.16, C_{glob} = \infty$ 

$$T = 5, N = 5, r = 0.03$$

σ m	m	Price		Time (s) 2	
		Bin	SP	Bin	SP
	200	0.173716366	0.173716366	0.0165	0.00828
0.2	500	0.173922597	0.173922671	0.0875	0.0437
	1000	0.174051949	0.174051983	2.38	0.183
	200	0.150465004	0.150466828	600	6.09
0.0	2 500	0.150508871	0.150510526	$\infty$	24.2
	1000	0.150522368	0.150524027	$\infty$	55

 $<sup>^{2}\</sup>infty$  means time taken is more than an hour.



### 20'5'0 SPM for cliquet options: summary

- □ Introduced by Gaudenzi et al [GZ11] in 2011.
- Convergent to exact CRR and thus BS.
- ☑ Approximation A priori error bounds.
- ☑ Significant speed improvement in low volatility cases against binomial model.
- Can be used for local volatility models and varying interest rates in each period.
- $\square$  Fast experimental order of complexity  $O(m^2)$ .
- Difficult to compute theoretical complexity.



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- ► Efficient technique to evaluate path-dependent exotic options.
- ► Theory varies with option type.
- Asian: the method is complicated and is not flexible, although being fast and efficient. Easily generalised to the American case and to lookback options. Fails to be generalised for geometric mean and local volatility models.
- Cliquet: flexible method; takes care of local volatility and interest rates. We found out that computational complexity (experimental) is approximately O(m²) for low m.

#### Further research

- Theoretical complexity: dependence of singular point redundancy on initial data.
- Verify complexity for large m.
- ► Customising the method for other path-dependent options.

# Questions?

Thank you!

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