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PARALLELIZING BLACK-SCHOLES PDE SOLVING ON AN OPEN DOMAIN WITH SCHUR DECOMPOSITION METHOD

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Abstract: In this paper we will provide some parallel algorithms for PRAM and BSP architectures for solving Black-Scholes PDE on an open domain (on support, non temporal dimension) and without frontier condition there. We suppose exist an PDE solver (like an implicit method based on algebraic system solver) for a rectangle with conditions only on two adjacent lines from border, after computation we will use computed value for an other rectangle with same PDE solver.

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1. BLACK-SCHOLES-MERTON MODEL AND BLACK-SCHOLES PDE

One of popular stochastic equation that models a traded asset (like a stock) is the *Black-Scholes-Merton model* based on *geometric brownian motion* (see [1]):

$$dS(t)=S(t)[\mu dt+\sigma dW(t)] \quad (1)$$

where $(S(t), t \geq 0)$ is the stochastic process for asset value at timestamp t , $(W(t), t \geq 0)$ is a *Wiener standard process* (see [2]), μ is the *drift rate of return* and σ is *volatility*.

A derivative based on this asset is an other traded asset that fructify at *maturity time* T , payoff depend on value of support, $S(T)$. *payoff* function is defined as:

$$\text{payoff}: \mathbb{R}_+ \rightarrow \mathbb{R} \quad (2)$$

Main problem is pricing of a financial derivative. For this, we build an risk-free portfolio based on some supports and some derivatives. After applying of Ito lemma (see [3]) we obtain Black-Scholes PDE (see [4]):

$$V_t + \frac{1}{2} \sigma^2 S^2 V_{SS} + r S V_S - r V = 0 \quad (3)$$

for pricing derivatives, where:

$$V: \mathbb{R}_+ \times [0, T] \rightarrow \mathbb{R}_+ \quad (4)$$

and $V(S, t)$ is value of derivatives at timestamp t if support is valued as S .

Note that for a generalized brownian motion:

$$dS(t)=A(S(t), t)dt+B(S(t), t)dW(t) \quad (5)$$

where $A(S,t)$ and $B(S,t)$ are some algebraic expression, we can build a generalized form of Black-Scholes PDE (see [5]):

$$V_t + \frac{1}{2}B^2V_{SS} + rSV_S - rV = 0 \quad (6)$$

Black-Scholes PDE and generalized Black-Scholes PDE can be linked with Dirichlet condition:

$$V(0,t) = 0 \quad (7)$$

$$V(S,T) = \text{payoff}(S) \quad (8)$$

that means for 0 value of support, derivatives is valued to 0 too, and value at maturity is payoff function.

$$D_{i,j} = \{ (s, t) \mid t \in [(N+1-i)T/N, (N-i)T/N], s \in [(j-1)\Delta, j\Delta] \} \quad (10)$$

like in figure 1:

9,5	9,4	9,3	9,2	9,1
8,5	8,4	8,3	8,2	8,1
7,5	7,4	7,3	7,2	7,1
6,5	5,4	6,3	6,2	6,1
5,5	5,4	5,3	5,2	5,1
4,5	4,4	4,3	4,2	4,1
3,5	3,4	3,3	3,2	3,1
2,5	2,4	2,3	2,2	2,1
1,5	1,4	1,3	1,2	1,1

Figure 1. Decomposition of D (partial) in $D_{i,j}$

and solving PDE successively on $D_{1,1}, D_{1,2}, D_{2,1}, D_{1,3}, D_{2,2}, D_{3,1}$, etc like in figure 2.

2. SCHUR DECOMPOSITION METHOD FOR BLACK-SCHOLES PDE ON AN OPEN DOMAIN

Schur method (see [6]) is based on decomposition of an initial domain D of a Dirichlet problem $Lu=0$ in two or more problems $Lu=0$ defined on domains D_1, D_2, \dots , where union of domains cover D:

$$D \subseteq D_1 \cup D_2 \cup \dots \quad (9)$$

with Dirichlet conditions on some frontiers as subset of $\partial D_i \cap \partial D$

The main idea to solve generalized Black-Scholes PDE (6) is splitting domain D in rectangles ($D_{i,j}, i=1,N, j \geq 1$)

45	44	42	39	35
9,5	9,4	9,3	9,2	9,1
43	41	38	34	30
8,5	8,4	8,3	8,2	8,1
40	37	33	29	25
7,5	7,4	7,3	7,2	7,1
36	32	28	24	20
6,5	5,4	6,3	6,2	6,1
31	27	23	19	15
5,5	5,4	5,3	5,2	5,1
26	22	18	14	10
4,5	4,4	4,3	4,2	4,1
21	17	13	9	6
3,5	3,4	3,3	3,2	3,1
16	12	8	5	3
2,5	2,4	2,3	2,2	2,1
11	7	4	2	1
1,5	1,4	1,3	1,2	1,1

Figure 2. Succession on solving PDE on $D_{i,j}$

If suppose that SOLVERECTANGLE(i,j) solve Black-Scholes PDE on $D_{i,j}$ with any method (like an implicit method) in Dirichlet conditions un right and bottom frontiers like in figure 3:



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9,5	9,4	9,3	9,2	9,1
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7,5	7,4	7,3	7,2	7,1
6,5	6,4	6,3	6,2	6,1
5,5	5,4	5,3	5,2	5,1
4,5	4,4	4,3	4,2	4,1
3,5	3,4	3,3	3,2	3,1
2,5	2,4	2,3	2,2	2,1
1,5	1,4	1,3	1,2	1,1

Figure 3. Right and bottom Dirichlet condition is precomputed on previous call of SOLVERECTANGLE(i,j)

Serial algorithm for this method is:

```

Algorithm SchurSerial
For K=2 to M+N
  For I=max(1,K-N) To min(M,K-1)
    SOLVERECTANGLE(I,K-I)
  End For
End For
End Algorithm

```

3. PARALLELIZATION OF SCHUR METHOD FOR A PRAM ARCHITECTURE

A good idea for parallelization of previous algorithm on a PRAM architecture (see [7]) is parallel execution of internal FOR that means all $D_{i,j}$ on same diagonal ($i+j$ invariant) can be processed in parallel. Parallel PRAM Algorithm is:

```

Algorithm SchurPRAM
For K=2 to M+N
  // diagonal can be processed

```

```

// in parallel
Parallel For I=max(1,K-N) To
min(M,K-1)
  SOLVERECTANGLE(I,K-I)
End For
End For
End Algorithm

```

In figure 4 is shown with same colour parallel PRAM steps:

45	9,5	44	9,4	42	9,3	39	9,2	35	9,1
43	8,5	41	8,4	38	8,3	34	8,2	30	8,1
40	7,5	37	7,4	33	7,3	29	7,2	25	7,1
36	6,5	32	6,4	28	6,3	24	6,2	20	6,1
31	5,5	27	5,4	23	5,3	19	5,2	15	5,1
26	4,5	22	4,4	18	4,3	14	4,2	10	4,1
21	3,5	17	3,4	13	3,3	9	3,2	6	3,1
16	2,5	12	2,4	8	2,3	5	2,2	3	2,1
11	1,5	7	1,4	4	1,3	2	1,2	1	1,1

Figure 4. Coloured parallel PRAM steps

Main problem is when $\min(M,N) \bmod P$ is not null, that means some processors will be free at last part of parallel for execution. Is a good idea to try $\min(M,N)$ as a multiply of P , because all calls of SOLVERECTANGLE are similar, because problems are similar on each subdomains.

4. PARALLELIZATION OF SCHUR METHOD FOR A BSP ARCHITECTURE

For a BSP architecture (see [8]) that has $P=\min(M,N)$ processors, that can process in parallel an entire diagonal of subdomains ($i+j = K$).

In figure 5, domains coloured with same colour will be processed as same processor:

45 9,5	44 9,4	42 9,3	39 9,2	35 9,1
43 8,5	41 8,4	38 8,3	34 8,2	30 8,1
40 7,5	37 7,4	33 7,3	29 7,2	25 7,1
36 6,5	32 6,4	28 6,3	24 6,2	20 6,1
31 5,5	27 5,4	23 5,3	19 5,2	15 5,1
26 4,5	22 4,4	18 4,3	14 4,2	10 4,1
21 3,5	17 3,4	13 3,3	9 3,2	6 3,1
16 2,5	12 2,4	8 2,3	5 2,2	3 2,1
11 1,5	7 1,4	4 1,3	2 1,2	1 1,1

Figure 5. Coloured BSP processor assign

Parallel algorithm for BSP architecture is:

Algorithm SchurBSP

For $K=2$ to $M+N$

 Macrostep Start

$A = \max(1, K-N)$

$B = \min(M, K-1)$

 For $I=A$ To B

 If ProcessorId = $I-A+1$ Then

 Call SOLVERECTANGLE($I, K-I$)

 End If

 // sincronize border data with other

 // processors

 If $K < \min(M, N)$ then

 If ProcessorId $< \min(M, N)$ then

 SendBorderData(ProcessorId+1)

 End If

 Else

 If ProcessorId > 1 Then

 SendBorderData(ProcessorId-1)

 End If

 End If

 End For

 MacroStep Stop

End For

End Algorithm

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