

EE3980 Algorithm  
HW6. Stock Short Selling Revisited  
106061225 楊宇羲

**1. Problem Description:**

In homework 4, we have discussed how the maximum sub array is found. Here are some introduction about how we can maximum the stock selling profit: Our strategy is to sell stocks at high price and buy it at low price. Thus, we just have to find a large price followed by a minimum value to create max profit. Being provided with a chart with everyday's price on, we have to be able to figure out the max value array to maximize the profit we get. Given an array with size  $n$ , we have to choose two integer  $i, j$  in the range of  $n$  such that the sum from  $A[i]$  to  $A[j]$  gets the biggest value. We previously solved the brute force solution by finding max sum between a varying range of the array, which is  $C_2^n = \frac{n(n-1)}{2}$  combinations. However, in this homework we will revise the brute-force version to calculation-free version, which means that we don't have to calculate the sum. We will merely just pick one of the  $C_2^n$  combinations such that the head price minus the tail price brings the biggest price difference (with a minus sign). The most important part of this assignment is to come up with an idea to solve the max sub array problem with process time less than the divide & conquer method. To accomplish this requirement, we have to find a method with time complexity that is smaller than  $O(n \lg n)$ . After doing some research and some brainstorming, I decided to apply a dynamic programming approach (Kadane's algorithm) to solve the problem.

**2. Approach:**

First we will read in all the needed data, including repetition time  $R$ , data size  $N$ , and store the dates, price in the structure STKprice with everyday's change calculated. When all data are set, we can then start the timer and execute the MaxSubArrayBT(), MaxSubArrayBTI() in order with only one execution since it will take forever to finish 5000 executions. In this homework, we are actually going to use the *change* in the structure to carry out the maximum sub array problem instead of the improved version of brute force approach, since we only have to find the minimum price value followed by a large enough value. After the first two algorithms' time are recorded and printed, we can then execute the remaining two algorithms for 5000 times, which are divide & conquer and the dynamic program methods, then print the outcome as well.

Here are some specialized declaration of structure to complete this assignment:

```
Typedef struct STKprice {  
    int year, month, day;  
    double price, change;  
}STKprice;
```

```
Typedef struct RSLT {  
    int sell, buy;  
    double min;  
}RSLT;
```

The *STKprice* is same as the homework4, and the *RSLT* is for storing all the informations that are going to be returned, including sell date, buy date and the actual price difference (stated as *min* since we are looking for the max value with a negative sign). We also have to note that in the function *PrintData()* we have to shift the sell date one day earlier since the *sell* value we returned is the change of  $\text{day}(\text{sell}) - \text{day}(\text{sell} - 1)$ , so the starting date is actually the day before *sell*. The min value also have to be displayed as the absolute value so we have to add a minus sign when displaying it.

Algorithm *main*(void)

```
{  
    ReadData();                // read the date and the price of the corresponding date  
    t := GetTime();            // start counting time  
    result := SubArrayBT();     // implement brute force approach  
    t := GetTime() - t;        // stop counting time  
    Write (t, result);         // print outcome  
    t := GetTime();            // start counting time  
    result := SubArrayBTI();    // implement improved brute force approach  
    t := GetTime() - t;        // stop counting time  
    Write (t, result);         // print outcome  
    t := GetTime();            // start counting time  
    for i := 1 to Repeat do {  // repeat R times  
        result := SubArray();  // implement divide & conquer method  
    }  
    t := GetTime() - t;        // stop counting time  
    Write (t/Repeat, result);  // print outcome  
    t := GetTime();            // start counting time  
    for i := 1 to Repeat do {  // repeat R times  
        result := SubArrayDP(); // implement dynamic programming method  
    }  
    t := GetTime() - t;        // stop counting time  
    Write (t/Repeat, result);  // print outcome  
}
```

### 3. Analysis:

As mentioned in the problem description, the pseudo code of improved brute force approach is:

```
// Input: global array data[n]  
// Output: result.min, result.sell, result.buy  
// Solve the max sub array problem by checking possible combinations' difference  
Algorithm MaxSubArrayBTI (void)  
{  
    result.min := 0; // result initializations  
    result.sell := 1;  
    result.buy := n;  
    for i := 1 to n do { // pick head index  
        for j := i to n do { // pick tail index  
            if (data[j] - data[i] < result.min) { // compare difference  
                result.min = data[j] - data[i]; // update new minimum  
                result.sell = i + 1; // update new sell date  
                result.buy = j; // update new buy date  
            }  
        }  
    }  
    return result;  
}
```

In comparison with the original version of brute force method, the improved version abandoned the sum variable, which means that there are only two loops left, which will significantly increase the performance as  $O(n^3)$  is revised to  $O(n^2)$ . In this algorithm, we merely just check the  $C_2^n$  combinations and see which combination can create the most negative value when the front element minus the back element, which brings the time complexity of  $O(n^2)$  and space complexity of  $O(n)$  since there are only target array with size  $n$  and variables for loop and storing result.

On the other hand, the new introduced method's pseudo code is provided as below:

```
// Input: global array data[n]  
// Output: result.min, result.sell, result.buy  
// Solve the max sub array problem by Kadane's algorithm  
Algorithm MaxSubArrayDP (void)  
{  
    sell = 1; // temporary sell date  
    localmin = 0; // temporary minimum  
    result.min := 1000000; // set absolute min to  $\infty$   
    result.sell := 1; // initializations
```

```

    result.buy := n;
    for i := 1 to n do {
        if (data[i] < localmin + data[i]) {
            localmin = data[i];
            sell = i;
        } else {
            localmin = data[i] + localmin;
        }
        if (localmin < result.min) {
            result.min = localmin;
            result.buy = i;
            result.sell = sell;
        }
    }
    return result;
}

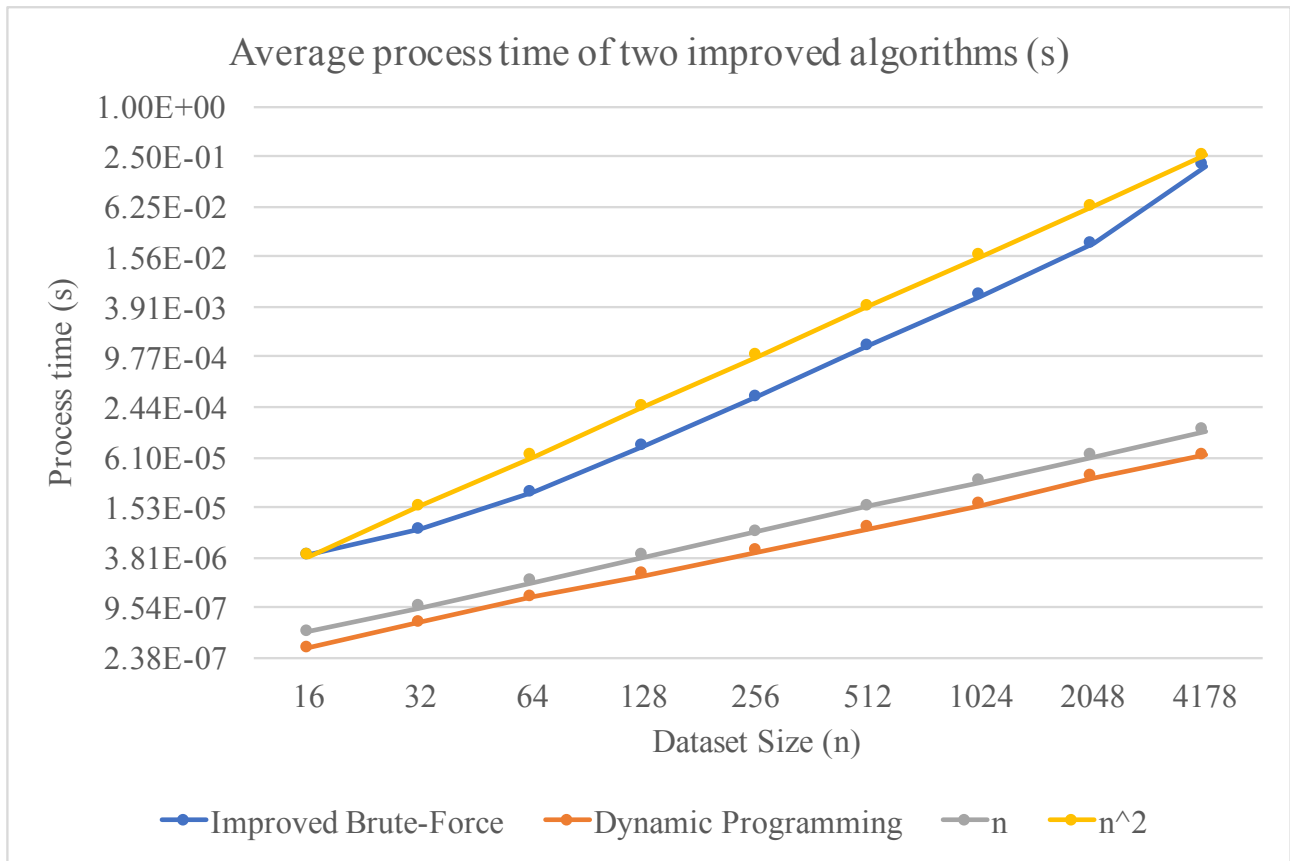
```

It is kind of unbelievable when I first found this  $O(n)$  algorithm since we have been focused on the  $n^3$ ,  $n^2$  methods so think that the  $n \cdot \lg(n)$  method will be the furthest optimization. However, we can find it interesting and effective when realized how this algorithm work. First of all, we need to have a concept that “if we know the max sub array in the range 1 to  $(i - 1)$ , then we can know the max sub array in the range 1 to  $i$ ”. To prove the correctness of the algorithm, we define  $Maxsum(i)$  as the max sub array that contains index  $i$ , which is  $\text{Max}\{\text{sum}(1, i), \text{sum}(2, i), \text{sum}(3, i), \dots, \text{sum}(i, i)\}$ , as we found  $Maxsum(i)$ , we can also find  $Maxsum(i + 1)$  since it will definitely contain element  $i + 1$ , so it has only two possibilities which is element  $(i + 1)$  or  $Maxsum(i) + \text{element}(i+1)$ . Hence we can split into two situations to discuss :

- a)  $Maxsum(i + 1) = \text{element}(i + 1)$ : sell date has to temporarily set to  $i + 1$ , then we compare  $Maxsum(i + 1)$  to the current absolute max value, if the former is larger then we update the sell date and the buy date.
- b)  $Maxsum(i + 1) = \text{element}(i + 1) + Maxsum(i)$ : we compare it to the current absolute max value directly and update the newest sell date and buy date.

After updating the current maximum value we can continue to check if  $Maxsum(i + 2)$  is larger or not. Eventually we got the time complexity of  $O(n)$  since we just run through the array for one time, and the space complexity of  $O(n)$  also because there are only target array with size  $n$  and variables for loop, local sell position and local minimum value.

#### 4. Results:

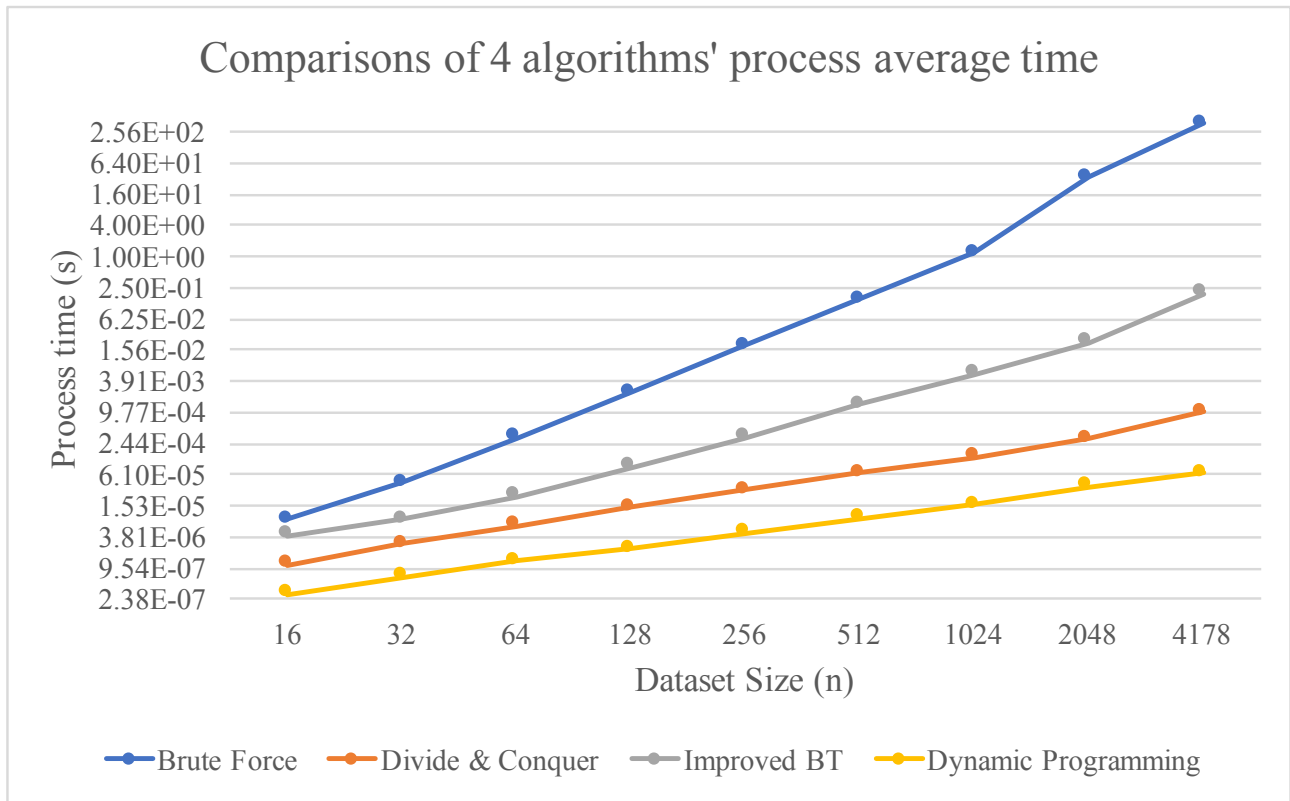


dataset size(n)	best sell date	sell price (USD)	best buy date	buy price (USD)	maximum earning per share (USD)	improved brute-force (s)	dynamic programming (s)
16	2004/8/23	54.8694	2004/9/3	50.1598	4.7096	4.05E-06	3.04E-07
32	2004/8/23	54.8694	2004/9/3	50.1598	4.7096	8.11E-06	6.30E-07
64	2004/11/1	98.3185	2004/11/10	84.1899	14.1286	2.29E-05	1.28E-06
128	2004/11/1	98.3185	2004/11/22	82.8056	15.5129	8.39E-05	2.29E-06
256	2005/7/21	157.4561	2005/8/22	137.4292	20.0269	3.20E-04	4.40E-06
512	2006/1/10	236.5452	2006/3/13	169.0518	67.4934	1.33E-03	8.46E-06
1024	2007/11/6	372.0435	2008/3/10	207.4504	164.5931	5.30E-03	1.59E-05
2048	2007/11/6	372.0435	2007/11/24	129.1186	242.9249	2.22E-02	3.50E-05
4178	2020/2/19	1524.87	2020/3/23	1054.13	470.74	1.96E-01	6.45E-05

This is the final result of this homework's revised algorithms. We can see that the result is closely matched to our analysis and the correctness of the algorithm got no problem as well.

## 5. Observation and conclusion:

The below figure and table is the overall comparisons of the four algorithms, and we can observe that the improved version in this homework bring significant impact on performance.



dataset size(n)	brute force process time (s)	divide & conquer average time (s)	improved brute- force (s)	dynamic programming (s)
16	8.10E-06	1.12E-06	4.05E-06	3.04E-07
32	4.31E-05	2.83E-06	8.11E-06	6.30E-07
64	3.15E-04	6.29E-06	2.29E-05	1.28E-06
128	2.34E-03	1.44E-05	8.39E-05	2.29E-06
256	1.86E-02	3.10E-05	3.20E-04	4.40E-06
512	1.47E-01	6.63E-05	1.33E-03	8.46E-06
1024	1.15E+00	1.30E-04	5.30E-03	1.59E-05
2048	3.29E+01	2.90E-04	2.22E-02	3.50E-05
4178	3.64E+02	1.00E-03	1.96E-01	6.45E-05

The last table shows each algorithms space complexity and time complexity, and it shows that the divide & conquer and the dynamic programming methods ace on performance.

	space complexity	time complexity
Brute force	$O(n)$	$\Theta(n^3)$
Improved brute force	$O(n)$	$\Theta(n^2)$
Divide & conquer	$O(n)$	$O(n \cdot \lg(n))$
Dynamic programming	$O(n)$	$O(n)$

```
$ gcc hw06.c
$ a.out < s7.dat
N = 1024
Brute-force approach: CPU time 0.467717 s
  Sell: 2007/11/6 at 372.0435
  Buy: 2008/3/10 at 207.4504
  Earning: 164.5931 per share.
Improved Brute-force approach: CPU time 0.001091 s
  Sell: 2007/11/6 at 372.0435
  Buy: 2008/3/10 at 207.4504
  Earning: 164.5931 per share.
Divide and Conquer: CPU time 4.76854e-05 s
  Sell: 2007/11/6 at 372.0435
  Buy: 2008/3/10 at 207.4504
  Earning: 164.5931 per share.
Dynamic Programming: CPU time 3.78361e-06 s
  Sell: 2007/11/6 at 372.0435
  Buy: 2008/3/10 at 207.4504
  Earning: 164.5931 per share.
```

Good, solution is correct.

'MaxSubArrayDP' algorithm can be more efficient if it works on the stock price, instead of the price change.

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score: 76.0

- Overall report writing
  - English writing needs more practice.
- Report format
  - Need double line spacing
- Introduction
  - Introduction can be strengthened
- Approach
  - 'MaxSubArrayDP' algorithm can be more efficient if it works on the stock price, instead of the price change.
- Program format can be improved



- Please follow the coding guidelines.

## hw06.c

```
1 // EE3980 HW06 Stock Short Selling Revisited
2 // 106061225, 楊宇羲
3 // 2021/4/13
4
5 #include <stdio.h>
6 #include <stdlib.h>
7 #include <sys/time.h>
8
9 typedef struct STKprice {                // Stock's price & date
10     int year, month, day;
11     double price, change;
12 }STKprice;
13     } STKprice;
14
15 typedef struct RSLT {                    // Contains start, end date and maximum
16     int sell, buy;
17     double min;
18 }RSLT;
19     } RSLT;
20
21 void ReadData(void);                    // read everyday's price
22 void PrintData(RSLT result);
23 double GetTime(void);                  // Get local time
24 RSLT MaxSubArrayBF(void);               // brute-force sub array solution
25 RSLT MaxSubArrayBFI(void);              // improved brute-force max sub array
26 RSLT MaxSubArray(int begin, int end);   // divide & conquer approach
27 RSLT MaxSubArrayXB(int begin, int mid, int end); // cross boundary condition
28 RSLT MaxSubArrayDP(void);
29
30 STKprice *data;                        // array to store price
31 int N;                                // size of array
32
33 int main(void)
34 {
35     int i = 0;                          // for loop
36     int R = 5000;                        // Repetition time
37     double t;                            // time variable
38     RSLT result;                          // contains start & end date and maximum
39 }
```

```

38     ReadData();                                // read in data
39
40     t = GetTime();                              // start counting CPU time
41     result = MaxSubArrayBF();                    // brute-force solution for 1 time
42     t = GetTime() - t;                          // end count time
43     printf("Brute-force approach: CPU time %g s\n", t); // print outcome
44     PrintData(result);
45
46     t = GetTime();                              // start counting CPU time
47     result = MaxSubArrayBFI();                   // improved brute-force solution
48     t = GetTime() - t;                          // end count time
49     printf("Improved Brute-force approach: CPU time %g s\n", t); // print
50     PrintData(result);
51
52     t = GetTime();                              // start counting time
53     for(i = 0; i < R; i++) {                     // repeat 5000 times
54         for (i = 0; i < R; i++) {                 // repeat 5000 times
55             result = MaxSubArray(0, N - 1); // divide and conquer approach
56         }
57     }
58     t = (GetTime() - t) / R;                      // end counting time
59     printf("Divide and Conquer: CPU time %g s\n", t); // print outcome
60     PrintData(result);
61
62     t = GetTime();                              // start counting time
63     for(i = 0; i < R; i++) {                     // repeat 5000 times
64         for (i = 0; i < R; i++) {                 // repeat 5000 times
65             result = MaxSubArrayDP();            // dynamic programming approach
66         }
67     }
68     t = (GetTime() - t) / R;                      // end counting time
69     printf("Dynamic Programming: CPU time %g s\n", t); // print outcome
70     PrintData(result);
71     return 0;
72 }
73
74 void ReadData(void)                             // read in data
75 {
76     int i = 0;                                  // for loop
77
78     scanf("%d", &N);                            // read in size of array
79     printf("N = %d\n", N);
80
81     data = (STKprice*)malloc(N * sizeof(STKprice)); // dynamic array allocation

```

```

77
78     for (i = 0; i < N; i++)                // scan in data
79     {
80         scanf("%d %d %d", &data[i].year, &data[i].month, &data[i].day);
81         scanf("%lf", &data[i].price);
82
83         // derive the change of today and yesterday except the first day
84         if (i != 0) data[i].change = data[i].price - data[i - 1].price;
85         else data[i].change = 0;
86     }
87 }
    Need a blank line here.
88 void PrintData(RSLT result)                // print outcome
89 {
90     printf("  Sell: %d/%d/%d at %.4lf\n", data[result.sell - 1].year,
91           data[result.sell - 1].month,
92           data[result.sell - 1].day,
93           data[result.sell - 1].price);
94     printf("  Buy: %d/%d/%d at %.4lf\n", data[result.buy].year,
95           data[result.buy].month,
96           data[result.buy].day,
97           data[result.buy].price);
98     printf("  Earning: %.4lf per share.\n", -1 * result.min);
99 }
    Need a blank line here.
100 double GetTime(void)                    // get local time
101 {
102     struct timeval tv;
103
104     gettimeofday(&tv, NULL);
105     return tv.tv_sec + 1e-6 * tv.tv_usec; // sec + micro sec
106 }
    Need a blank line here.
107 RSLT MaxSubArrayBF(void)                // brute-force solution
108 {
109     int i, j, k;                        // for loops
110     RSLT result;                        // for storing low, high, change
111     result.min = 0.0;                    // initializations of result
112     result.sell = 0;
113     result.buy = N - 1;
114

```

```

115     for (i = 0; i < N; i++) {                // determine start index
116         for (j = i; j < N; j++) {            // determine end index
117             double sum = 0;                  // start counting sum
118             Do not mix declarations with statements
119             for (k = i; k <= j; k++) {        // from start to end
120                 sum += data[k].change;       // derive sum
121             }
122             if (sum < result.min) {
123                 result.min = sum;            // found max, update informations
124                 result.sell = i;
125                 result.buy = j;
126             }
127         }
128     return result;
129 }

    Need a blank line here.

130 RSLT MaxSubArrayBFI(void)                   // improved brute-force solution
131 {
132     int i, j;                                // for loops
133     RSLT result;                             // for storing low, high, change
134     result.min = 0.0;                         // initializations of result
135     result.sell = 0;
136     result.buy = N - 1;
137
138     for (i = 0; i < N; i++) {                // determine start index
139         for (j = i; j < N; j++) {            // determine end index
140             if (data[j].price - data[i].price < result.min) { // find smaller
141                 result.min = data[j].price - data[i].price;
142                 result.sell = i + 1;         // store new sell date
143                 result.buy = j;              // store new buy date
144             }
145         }
146     }
147
148     return result;                           // return result
149 }

    Need a blank line here.

150 RSLT MaxSubArray(int begin, int end)         // divide and conquer approach
151 {
152     RSLT result;                             // store information

```

```

153     int mid;                                // initialization
154     if (begin == end) {                      // terminal condition
155         result.sell = begin;
156         result.buy = end;
157         result.min = 0;
158         return result;
159     }
160     mid = (begin + end) / 2;                  // determine middle index
161
162     RSLT lsum = MaxSubArray(begin, mid);      // check left sum
    Do not mix declarations with statements
163     RSLT rsum = MaxSubArray(mid + 1, end);    // check right sum
164     RSLT xsum = MaxSubArrayXB(begin, mid, end); // check cross boundary sum
165
166     // comparisons of the above three sums
167     if (lsum.min <= rsum.min && lsum.min <= xsum.min) {
168         return lsum;                          // left sum is the smallest
169     }
170     else if (rsum.min <= lsum.min && rsum.min <= xsum.min) {
171         return rsum;                          // right sum is the smallest
172     }
173     return xsum;                             // cross sum is the smallest
174 }
    Need a blank line here.
175 RSLT MaxSubArrayXB(int begin, int mid, int end) // cross boundary condition
176 {
177     RSLT result;                            // store information
178     int i;                                  // for loop
179     double sum;                             // for checking sum
180     double rsum;                            // right hand side's sum
181     double lsum;                            // left hand side's sum
182     result.sell = 0;                         // initialize sell's date
183     result.buy = mid + 1;                    // initialize buy's date
184
185     sum = 0.0;
186     lsum = 0.0;
187     for (i = mid; i > begin; i--) {
188         sum += data[i].change;                // counting sum
189         if (sum < lsum) {                     // determine left min
190             lsum = sum;                      // update left sum
191             result.sell = i;                  // update sell's date

```

```

192     }
193 }
194
195 sum = 0.0;
196 rsum = 0.0; // right hand side's sum
197 for (i = mid + 1; i < end; i++)
198 {
199     sum += data[i].change; // counting sum
200     if (sum < rsum) { // determine right sum
201         rsum = sum; // update right sum
202         result.buy = i; // update buy date
203     }
204 }
205
206 result.min = rsum + lsum; // update total sum
207 return result;
208 }
    Need a blank line here.
209 RSLT MaxSubArrayDP(void) // dynamic programming
210 {
211     RSLT result; // initializations
212     double localmin = 0.0;
213     int i; // for loop & buy date
214     int sell; // for sell date
215
216     sell = 1; // initial values
217     result.sell = 1;
218     result.buy = N - 1;
219     result.min = 10000000;
220
221     for (i = 0; i < N; i++) {
222         /* find max(data[i], data[i] + local min) */
223         if (data[i].change < localmin + data[i].change) {
224             localmin = data[i].change;
225             sell = i; // sell date recorded
226         } else {
227             localmin = data[i].change + localmin;
228         }
229         /* find max(local min, absolute min) */
230         if (localmin < result.min) {

```

```
231         result.min = localmin;           // minimum updated
232         result.buy = i;                   // buy date updated
233         result.sell = sell;               // sell date updated
234     }
235 }
236 return result;
237 }
238
```