

FRE6883 Financial Computation





What are prerequisites?

- Have knowledge about derivates and quantitative methods of option pricing.
- Be aware of elementary programming concepts such as variable declaration and flow control structures such as sequential, looping and conditional statements in general.
- Knowledge in another programming language such as Python is helpful. But it is important not try to fit C/C++ into the language you already know.





Why C++?

- C++ is an industry standard because of its flexibility and performance. It has been the selected language for backend engine in many software applications. Therefore, C++ is a powerful modern object-oriented language.
- Many 3rd party libraries have been created to integrate market data and conduct complex numerical calculations in C++ applications with high efficiency.





The Benefit of Learning C++

- C++ is very "close to the hardware". This means that memory could be allocated and deallocated in a custom-defined manner, and hardware components such as CPU and network interface card could be manipulated directly via system call in C++ applications.
- C++ is extremely versatile. A business question could be programmed in many ways.
- C++ is an ISO standard and will be around for long time.





The Difficulty of Learning C++

- C++ may not be an ideal language for beginners. It provides far more flexibility to programmers often than required and could confusing.
- It is very easy to make mistakes and have bugs especially when pointers are used.
- The object-oriented program concept is not easy to grasp.
- The good news is that once you know C++, learning other programming languages become easier.







The Different Styles in C++ Programming

- Structured/Procedural Programming, C-Style: using functions and function calls, not object-oriented.
- Object-Oriented Programming: Encapsulating data and associated functions in classes, inheritance and polymorphism.
- Generic Programming and Templates: Typeindependent classes for code reusability.







C/C++ Integrated Development Environment

MAC: XCode, should be preinstalled, otherwise, download from Apple Web site.

PC: Microsoft Visual Studio Community 2019, a free version of Microsoft Visual Studio.







C/C++ IDE for MAC



Welcome to Xcode

Version 11.3.1 (11C504)



Get started with a playground Explore new ideas quickly and easily.



Create a new Xcode project

Create an app for iPhone, iPad, Mac, Apple Watch, or Apple TV.



Clone an existing project

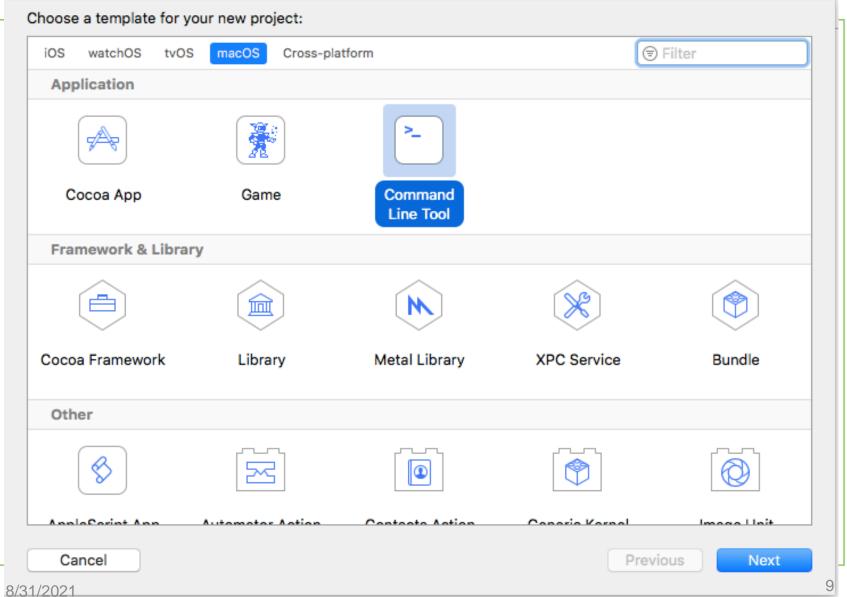
Start working on something from a Git repository.





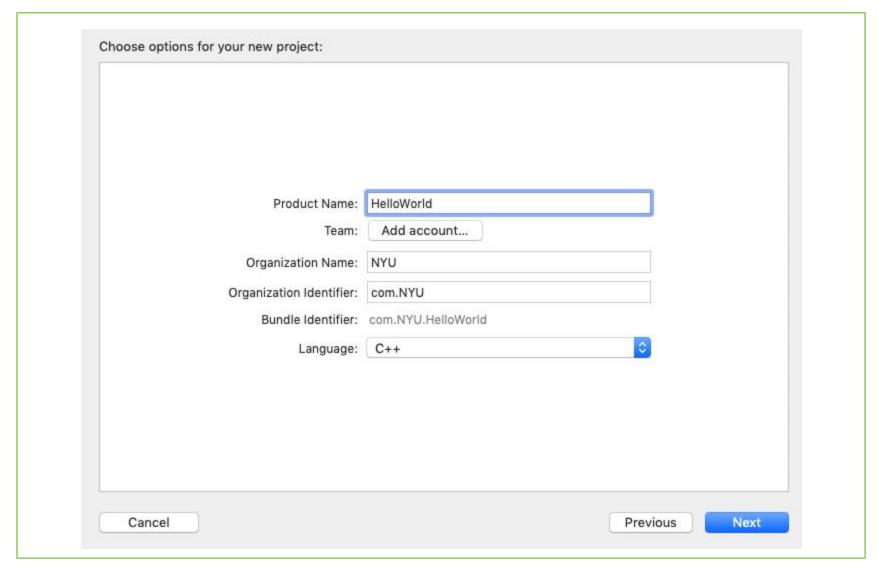


8



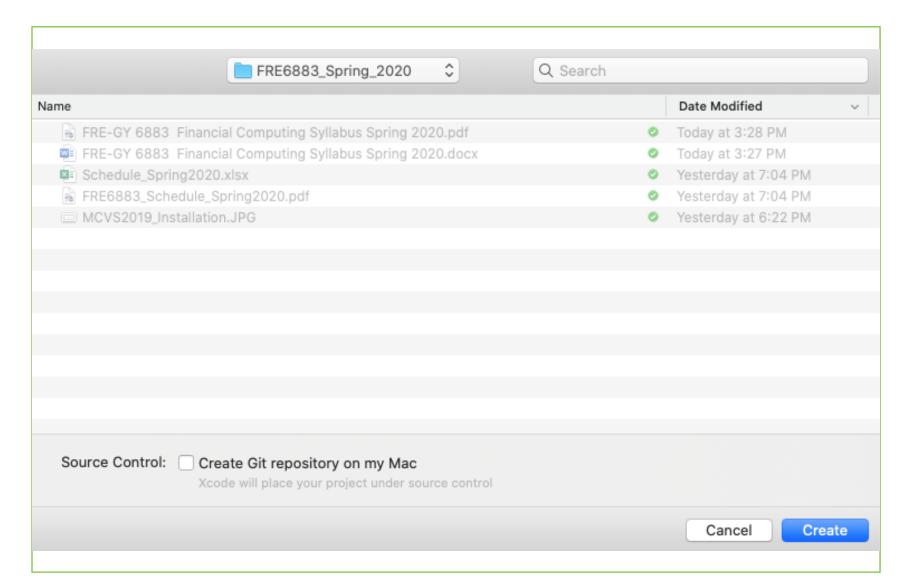








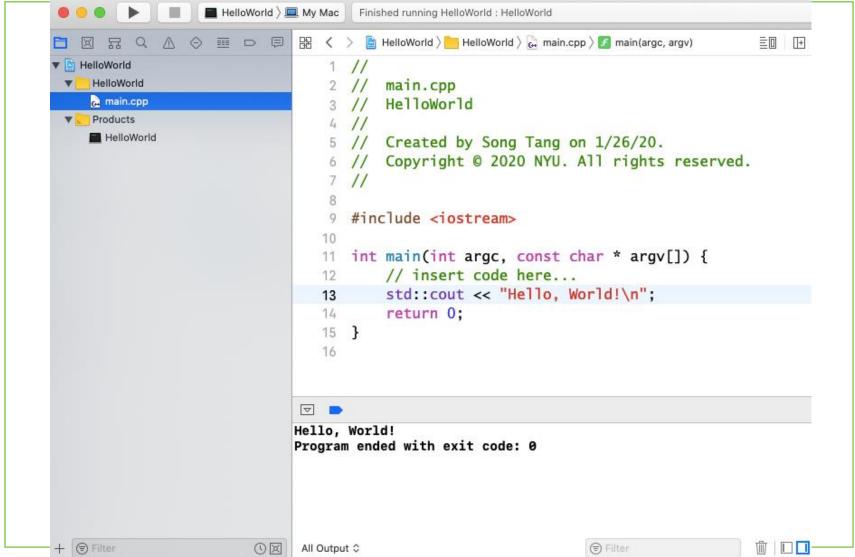




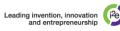
NYU-POLY
POLYTECHNIC INSTITUTE OF NEW YORK UNIVERSITY

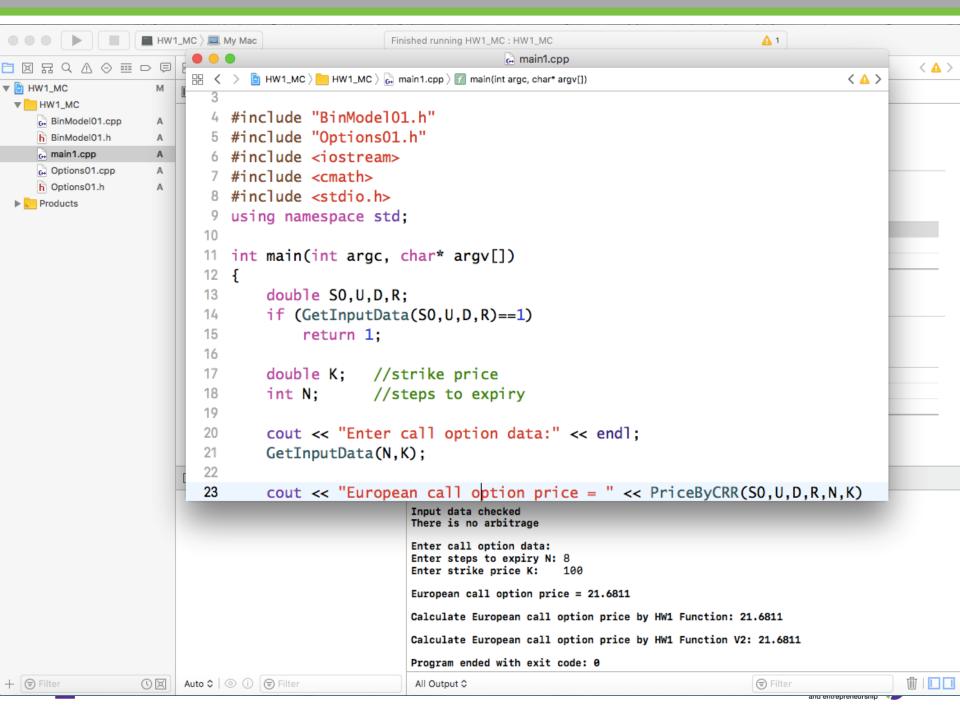












C/C++ Development Environment for PC

- Download Microsoft Visual Studio 2019 Community Version
- https://visualstudio.microsoft.com/downloads/

Downloads



Version: 16.2 Release notes

Compare editions How to install offline

Visual Studio 2019

Full-featured integrated development environment (IDE) for Android, iOS, Windows, web, and cloud

Community

Powerful IDE, free for students, opensource contributors. and individuals

Download Preview >

Professional

Professional IDE best suited to small teams

Download Preview >

Enterprise

Scalable, end-to-end solution for teams of any size

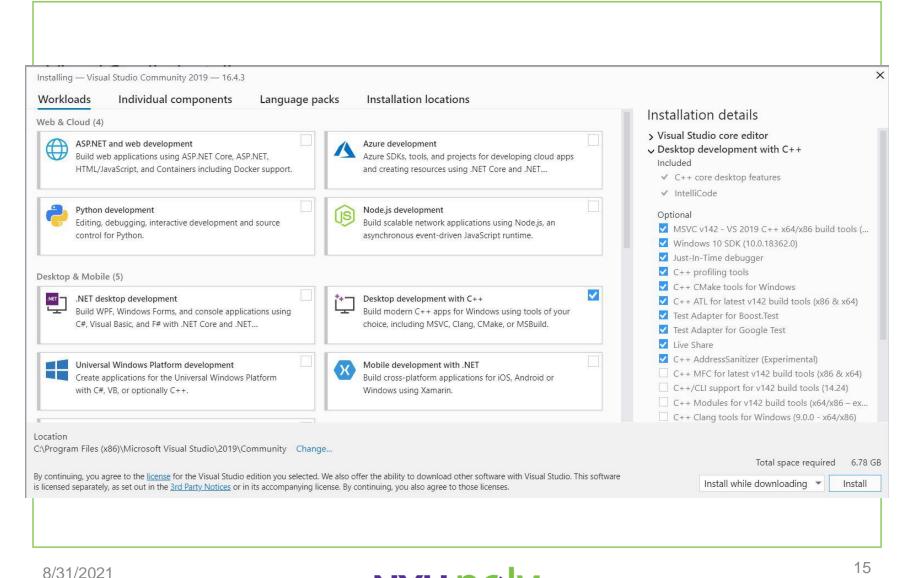
Download Preview >

14





8/31



NYU-pol POLYTECHNIC INSTITUTE OF NEW YORK UNIVERSITY

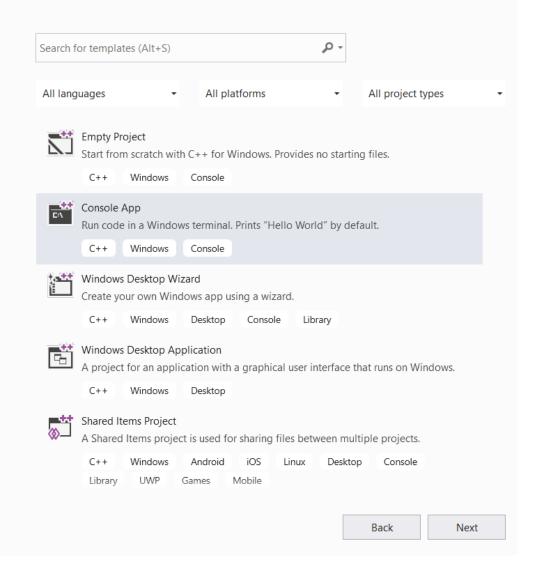




Create a new project

Recent project templates

A list of your recently accessed templates will be displayed here.









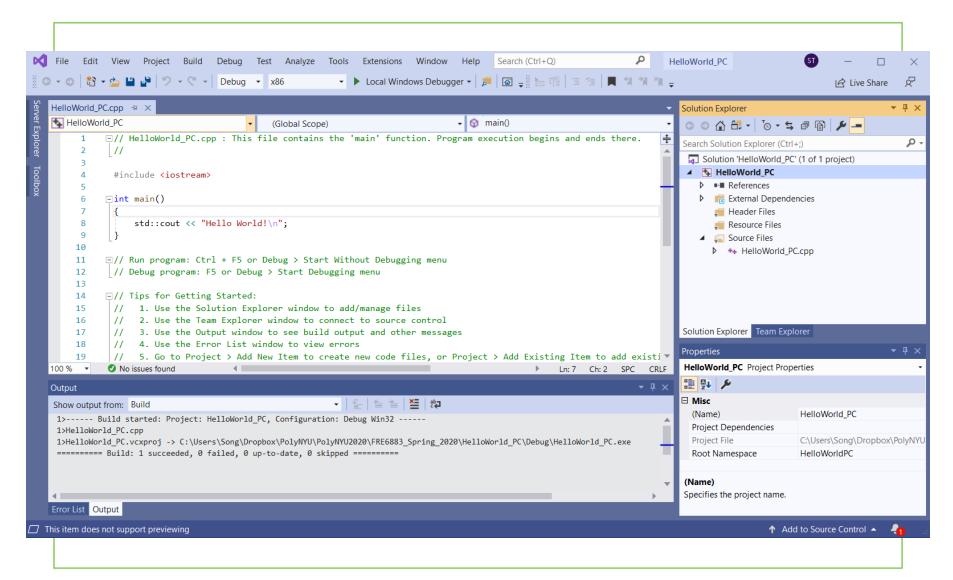
Configure your new project

Console App C++ Windows Console	
Project name	
HelloWorld_PC	
Location	
C:\Users\Song\Dropbox\PolyNYU\PolyNYU2020\FRE6883_Spring_2020\	
Solution name (1)	
HelloWorld_PC	
Place solution and project in the same directory	



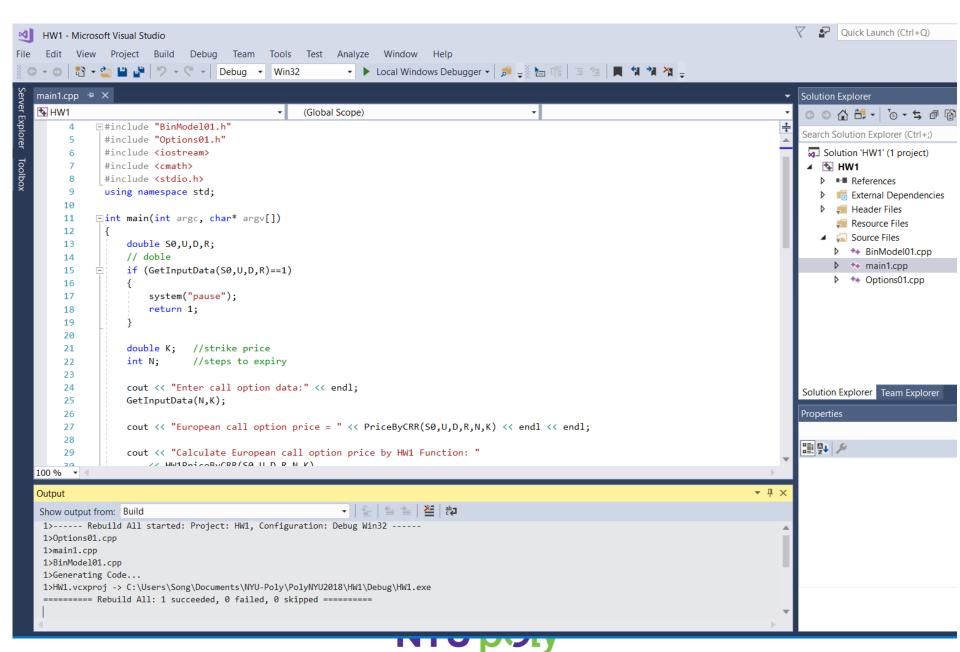


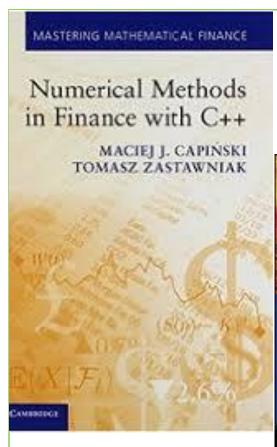


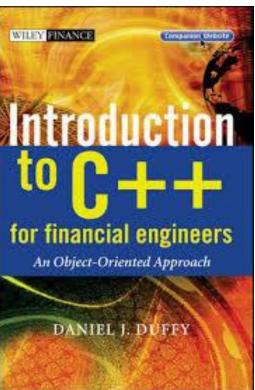


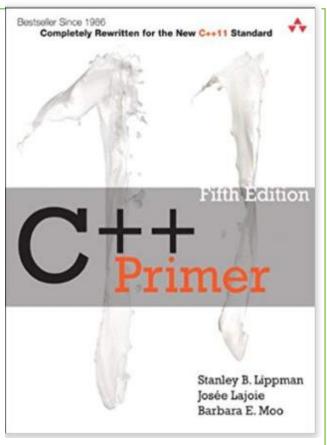
















Topic 1: Structured Programming Binomial Tree Model Implementation





The Structured Programming

 Structured programming is a technique which arose from the analysis of the flow control structures which underlie all computer programs. It is possible to construct any flow control structure from three basic structures: sequential, conditional and iterative. We will use the structured programming to price European options via the binomial model.





Our first C++ program

```
#include <iostream>
using namespace std;
int main()
{ //display message
  cout << "Hello World!" << endl;</pre>
  // take input from keyboard
  double price = 0.0;
  cin >> price;
  cout << "price = " << price << endl;
  char x = '\0'; // null character
  cin >> x;
  cout << "x = " << x << endl;
  return 0;
```





- <iostream> header file for input and output
- namespaces std
- main function
- comments
- cin, cout and endl
- variables

```
Hello World!
23.45
price = 23.45
x = A
```





Binomial Option Pricing in C/C++

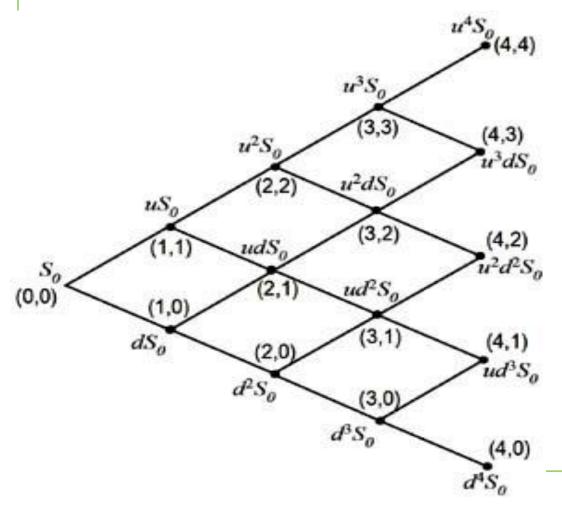
- The Structured Programming
 - Binomial Tree Model
 - Based on Function, Array and Pointer
 - CRR Option Pricer
 - Based on Function Call and Function Pointer
- The Object-Oriented Programming in C++
 - Binomial Tree Model Class
 - Based on C++ class
 - Option Pricer Framework
 - Based on Inheritance and Polymorphism







Binomial Tree Model



$$S(n,i) = S(0)(u)^{i}(d)^{n-i}$$
at step n and node i,
where S(0) > 0, u > d > 0
and n >= i >= 0

Cox-Ross-Rubinstein (CRR) procedure

- At the expiry date N, H(N, i) = h(S(N,i)), for each node i = 0, 1, ..., N
- If H(n+1, i) is already known at each node i = 0, 1, ..., n+1 for some n = 0, 1, ...N-1, then for each i = 0, 1, ...,n

$$H(n,i) = \frac{qH(n+1,i+1) + (1-q)H(n+1,i)}{1+R}$$

- q = (R-D)/(U-D) is the risk-neutral probability
- The payoff functions

$$h^{call}(z) = \begin{cases} z - K & \text{if } z > K \\ 0 & \text{otherwise} \end{cases} = (z - K)^{+} \quad h^{put}(z) = \begin{cases} K - z & \text{if } z < K \\ 0 & \text{otherwise} \end{cases} = (K - z)^{+}$$

NYU:poly





Binomial Tree Model

- Using binomial tree model for asset pricing
- Compute and display the stock price

$$- S(n,i) = S(0)(u)^{i}(d)^{n-1}$$

cout << S(n,i) = < S0*pow(u,i)*pow(d,n-i) << endl;







BinomialTreeModel01.cpp

```
// Calculate asset price at a specific node on the Binomial Tree
#include <iostream>
#include <iomanip>
#include <cmath>
using namespace std;
int main() {
double u = 1.15125, d = 0.86862;
double s0 = 106.00;
// compute asset price at node n = 3, i = 2
int n = 3;
int i = 2;
cout << "Asset Price at Binomial Tree Node(" << n << "," << i << ") = " << fixed << setprecision(2);
cout \ll s0 * pow(u, i) * pow(d, n - i);
cout << endl;
return 0;
/*
Asset Price at Binomial Tree Node(3,2) = 122.03
```





What we learned from BinomialTreeModel01.cpp:

- #include <iomanip>
 - << fixed << setprecision(2);</pre>
- #include <cmath>
 - pow(u, i) * pow(d, n i);
- How to Compute asset price at a node entered by user?

```
- int n = 0;
```

- int i = 0;
- cout << "Enter values for n and i: ";</p>
- cin >> n >> i;
- How to compute asset price at Every Node on the Binomial Tree?





8/31/2021



30

BinomialTreeModel02.cpp

```
// Calculate asset price at every node on the Binomial Tree
#include <iostream>
#include <iomanip>
#include <cmath>
using namespace std;
int main()
      double u = 1.15125, d = 0.86862;
      double s0 = 106.00;
      for (int n = 0; n \le 8; n++)
             for (int i = 0; i <= n; i++)
                   cout << "Asset Price at Binomaial Tree Node(" << n << "," << i
                    << ") = " << fixed << setprecision(2);</pre>
                   cout \ll s0 * pow(u, i) * pow(d, n - i) \ll endl;
      return 0;
```





What we learned from BinomialTreeModel02.cpp:

Nested for loops:

```
- for (int n = 0; n <= 8; n++)
• for (int i = 0; i <= n; i++)</pre>
```

- The Big-O notation:
 - express the upper bound of the runtime of an algorithm and thus measure the worst-case time complexity of an algorithm.
- Increment or decrement:

 How could we store the asset price values from the Binomial Tree?







BinomialTreeModel03.cpp

```
// Use one-dimensional array to hold asset price
// at every node on the Binomial Tree
#include <iostream>
#include <iomanip>
#include <cmath>
using namespace std;
const int SIZE = 81;
int main()
     double u = 1.15125, d = 0.86862;
     double s0 = 106.00;
     double aPrice = 0.0;
     double prices[SIZE];
     for (int i = 0; i < SIZE; i++)
          prices[i] = 0.0;
```

8/31/2021 **NYU: POL**





```
// Compute asset price at every node on the Binomial Tree
// and store in the price array
int index = 0;
for (int n = 0; n \le 8; n++)
     for (int i = 0; i <= n; i++)
          aPrice = s0 * pow(u, i) * pow(d, n - i);
          prices[index++] = aPrice;
```





```
// Print out the value in the price array
index = 0;
for (int n = 0; n \le 8; n++)
           for (int i = 0; i <= n; i++)
                 cout << "Asset Price at Binomaial Tree Node("</pre>
                      << n << "," << i << ") = "
                      << fixed << setprecision(2);
                 cout << prices[index++];</pre>
                 cout << endl;</pre>
     return 0;
```

NYU:poly



What we learned from BinomialTreeModel03.cpp:

- One-Dimensional Array:
 - const int SIZE = 81;
 double prices[SIZE];
 for (int i = 0; i < SIZE; i++)
 prices[i] = 0.0;
- An array is a series of elements of the same type placed in contiguous memory locations that can be individually referenced by adding an index to a unique identifier.
 - What is Big-O for reading and writing one value from to an array?
 - What is the Big-O for adding and deleting a value from the front of the array?
- There is NO boundary check for an array.







BinomialTreeModel04.cpp

```
// Validate data before calculating asset price on the Binomial Tree
#include <iostream>
#include <iomanip>
#include <cmath>
using namespace std;
int main()
double u = 1.15125, d = 0.86862, r = 1.00545;
double s0 = 106.00;
if (s0 <= 0.0 || u <= 0.0 || d <= 0.0 || r <= 0.0 || u <= d)
    cerr << "Invalid data, terminate program without calculation" << endl;
    return -1;
```

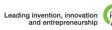




```
if (r >= u || r <= d)
     cerr << "Arbitrage exists, terminate program without calculation" << endl;</pre>
     return -1;
// Compute asset price at every node on the Binomial Tree
for (int n = 0; n \le 8; n++)
     for (int i = 0; i <= n; i++)
           cout << "Asset Price at Binomaial Tree Node("</pre>
           << n << "," << i << ") = " << fixed << setprecision(2);
          cout \ll s0 * pow(u, i) * pow(d, n - i) \ll endl;
return 0;
```

W NEW YORK UNIVERSITY





What we learned from BinomialTreeModel04.cpp:

- Validate the data used for calculating asset price values on a Binomial Tree. If any the data used for calculation is invalid or there is an arbitrage, the program will be terminated without further calculation.
- Return nonzero when validation fails.
- Logic operator OR in the if statement.







BinomialTreeModel.h

```
#pragma once
namespace fre {
    //compute risk-neutral probability
    double RiskNeutProb(double U, double D, double R);
    //compute the asset price at node n,i
    double CalculateAssetPrice(double S0, double U, double D, int n, int i);
    //input, display, and check model data
    int GetInputData(double& S0, double& U, double& D, double& R);
    //validate input data for Binomial Tree Model
    int ValidateInputData(const double& S0, const double& U, const double& D,
    const double& R);
```







BinomialTreeModel.cpp

```
#include "BinomialTreeModel.h"
#include <iostream>
#include <cmath>
using namespace std;
namespace fre {
  //compute risk-neutral probability
  double RiskNeutProb(double U, double D, double R)
    return (R - D) / (U - D);
  //compute the asset price at node n,i
  double CalculateAssetPrice(double S0, double U, double D, int n, int i)
    return S0 * pow(U, i) * pow(D, n - i);
```







```
//input and display, check model data
  int GetInputData(double& S0, double& U, double& D, double& R)
    //entering data
    cout << "Enter S0: "; cin >> S0;
    cout << "Enter U: "; cin >> U;
    cout << "Enter D: "; cin >> D;
    cout << "Enter R: "; cin >> R;
    cout << endl;
    //making sure that S0>0, U>D>0, R>0
    if (S0 <= 0.0 | | U <= 0.0 | | D <= 0.0 | | U <= D | | R <= 0.0)
      cout << "Illegal data ranges" << endl;
      cout << "Terminating program" << endl;
      return -1;
```







```
//checking for arbitrage
if (R >= U | | U <= D)
  cout << "Arbitrage exists" << endl;</pre>
  cout << "Terminating program" << endl;</pre>
  return -1;
cout << "Input data checked" << endl;</pre>
cout << "There is no arbitrage" << endl << endl;</pre>
return 0;
```

NYU:poly



```
int ValidateInputData(const double & S0, const double & U,
                             const double& D, const double& R)
 { //making sure that S0>0, U>D>0, R>0
    if (SO <= 0.0 | | U <= 0.0 | | D <= 0.0 | | U <= D | | R <= 0.0)
      cout << "Illegal data ranges" << endl;
      cout << "Terminating program" << endl;</pre>
      return -1;
    //checking for arbitrage
    if (R >= U \mid | U <= D)
    { cout << "Arbitrage exists" << endl;
      cout << "Terminating program" << endl;</pre>
      return -1;
    cout << "Input data checked" << endl;</pre>
    cout << "There is no arbitrage" << endl << endl;</pre>
    return 0:
```









BinomialTreeModel05.cpp

```
#include "BinomialTreeModel.h"
#include <iostream>
#include <iomanip>
#include <cmath>
using namespace std;
using namespace fre;
int main()
    double u = 1.15125, d = 0.86862, r = 1.00545;
    double s0 = 106.00;
    if (ValidateInputData(s0, u, d, r) == -1)
    return -1;
```

NYU:poly



NEW YORK UNIVERSITY



```
// Compute asset price at every node on the Binomial Tree
for (int n = 0; n <= 8; n++)
    for (int i = 0; i <= n; i++)
         cout << "Asset Price at Binomaial Tree Node(" << n << "," << i << ") = "
          << fixed << setprecision(2);
          cout << CalculateAssetPrice(s0, u, d, n, i);</pre>
         cout << endl;
return 0;
```

NYU-poly



What we learned from BinomialTreeModel05.cpp:

- Function Declaration in user-defined header file:
 - BinomialTreeModel.h
- Function Definition in cpp file:
 - BinomialTreeModel.cpp
- Invoke Binomial Tree Model functions in main() function:
 - BinomialTreeModel05.cpp
 - Call by Value (Passed by Value) and Call by Reference (Passed by Reference)

NYU:poly





Call by Value:

passing arguments to a function copies the
 actual value of an argument into the parameter
 of the function. In this case, changes made to
 the parameter inside the function have no effect
 on the argument.





Call by Reference:

- A reference variable is an alias, that is, another name for an already existing variable. Once a reference is initialized with a variable, either the variable name or the reference name may be used to refer to the same variable.
- The parameter is an alias of the argument. In this case, changes made to the parameter inside the function have also change the argument.

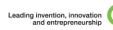




```
#include <iostream>
using namespace std;
void Foo(int a, int& b)
     a++;
     b++;
     cout << "In Function Foo a = " << a << " and b = " << b << endl;
int main()
    int x = 1, y = 1;
    Foo(x, y);
     cout << "In main function x = " << x << " and y = " << y << endl;
     return 0;
In function Foo a = 2 and b = 2
In main function x = 1 and y = 2
```







Question?

What happen if it is

```
void Foo(int a, const int& b)
    a++;
    b++;
    cout << "In Function Foo a = " << a
        << " and b = " << b << endl;
```





CRR Pricer

Within the Binomial Tree Model, the price
 H(n,i) at each time step n and node i of a
 European option with expiry date N and payoff
 h(S(N)) can be computed using the Cox-Ross Rubistein (CRR) procedure.

8/31/2021





NEW YORK UNIVERSITY

Option01.h

8/31/2021





NEW YORK UNIVERSITY

Option01.cpp

```
#include "Option01.h"
#include "BinomialTreeModel.h"
#include <iostream>
#include <cmath>
using namespace std;
namespace fre {
double PriceByCRR(double S0, double U, double D, double R, int N, double K)
    double q = RiskNeutProb(U, D, R);
    // If you are using MAX XCode
    // double Price[N];
    // If you use Microsoft Visual Studio 2019,
    double Price[9];
    for (int i = 0; i < sizeof(N); i++)
```

Price[i] = 0.0;





```
for (int i = 0; i <= N; i++)
    Price[i] = CallPayoff(CalculateAssetPrice(S0, U, D, N, i), K);
  for (int n = N - 1; n >= 0; n--)
    for (int i = 0; i <= n; i++)
       Price[i] = (q * Price[i + 1] + (1 - q) * Price[i]) / R;
  return Price[0];
double CallPayoff(double z, double K)
  if (z > K) return z - K;
  return 0.0;
```





OptionPricer02.cpp

```
#include "BinomialTreeModel.h"
#include "Option01.h"
#include <iostream>
#include <iomanip>
using namespace std;
using namespace fre;
int main()
   double u = 1.15125, d = 0.86862, r = 1.00545;
    double s0 = 106.00, k = 100.00;
    const int N = 8;
    double optionPrice = PriceByCRR(s0, u, d, r, N, k);
    cout << "European call option price = " << fixed <<</pre>
           setprecision(2) << optionPrice << endl;</pre>
    return 0;
```

// European call option price 31068



Homework Assignment

Modify the PriceByCRR() function in Option01.cpp to compute the current price (time 0) of a European option using CRR formula:

$$H(0) = \frac{1}{(R)^N} \sum_{i=0}^{N} \frac{N!}{i! (N-i)!} q^i (1-q)^{N-i} h(S(N,i))$$







References

• Numerical Methods in Finance with C++ (Mastering Mathematical Finance), by Maciej J. Capinski and Tomasz Zastawniak, Cambridge University Press, 2012, ISBN-10: 0521177162

8/31/2021 **NYU:** D



