

Time Complexity, Recursion and Function Memory Allocation.

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Previously

- If-Else (Binary Choice)
- If-Else-If Ladder (Multiple Choice)
- Nested If-Else (Two layers of Binary Choices)
- Loop (I. C. D. U.)
 - For Loop
 - While Loop
- Nested Loop
 - Example, print out matrix of stars

Today's Agenda

- Time Complexity of an Algorithm
 - Look back at prime finding algorithm.
- Recursion and Memory Layout

Finding Primes

Write a program that prints out all prime numbers from 1 to 100.

```
for(int i = 1; i <= 100; i++){  
    int numfactor = 0;  
    for (int j = 1; j <= i; j++){  
        if(i % j == 0){  
            numfactor = numfactor + 1;  
        }  
    }  
    if(numfactor == 2){  
        printf("%d ", i);  
    }  
}
```

How many iterations do we perform using the above code?

Making Code Faster!

$1 + 2 + 3 + 4 \dots 100 = 5050$ iterations.

Can we make the code run faster? i.e., doing the same things but with less iterations?

Making Code Faster!

Yes! We give up on checking factors when `numfactor > 2`.

```
for(int i = 1; i <= 100; i++){
    int numfactor = 0;
    for (int j = 1; j <= i; j++){
        if(i % j == 0){
            numfactor = numfactor + 1;
            if(numfactor > 2){
                break; // stop the current loop!
                       // go to check i+1!
            }
        }
    }
    if(numfactor == 2){
        printf("%d ", i);
    }
}
```

Making Code Even Faster!

The previous code runs only 1890 iterations!

Can we make the code even faster?

Making Code Even Faster!

- For each `i`, there cannot be any factor bigger than `i/2` except itself.

```
for(int i = 1; i <= 100; i++){  
    int numfactor = 1; // start counting from 1!  
    for (int j = 1; j <= i/2; j++){ // loop from 1 to i/2  
        if(i % j == 0){  
            numfactor = numfactor + 1;  
            if(numfactor > 2){  
                break;  
            }  
        }  
    }  
    if(numfactor == 2){  
        printf("%d ", i);  
    }  
}
```


Time Complexity

The above code runs only for 715 iterations!

- You can write **different** algorithms that solves the **same** computational problem.
- Some are faster, some are slower.
- The number of elementary computing cycles (loop iterations) that are required for an algorithm is called **the time complexity of the algorithm**.
 - In our prime finding example, the time complexity of $\text{alg. 1} > \text{alg. 2} > \text{alg. 3}$.
 - Time complexity is an important metric of the algorithmic efficiency.

Unsolved Mystery

Given a computational problem, what is the lowest time complexity that one can achieve?

- For many problems, we know how fast we can get.
- Printing number from 1-100 requires 100 for loop iterations. These problems are called **easy** problems.
- Finding the solution of a sudoku game requires many more iterations. These problems are called **hard** problems.

Can we translate all **hard** problems into **simple** problems to achieve a lower time complexity?

- Nobody knows.

Recursion

- You **cannot** define a function inside another function.
- You can **call** a function inside another function.
 - A function can call itself!

Recursion

- How do you countdown from 10 to 1?
 - i.e., printing out number 10 9 8 ... 1 ?

Recursion

- You can use a `for` loop.

```
for(int i = 10; i >= 1; i = i - 1) ...
```

- Or, you can use the following process:

i. initiate the countdown from $i=10$

ii. If $i \geq 1$, then

a. print the current number i

b. continue the countdown from $i-1$.

- Weirdly, this procedure is defined in terms of itself, i.e., the countdown process refers to itself.

Recursion

- A self-referential definition is called a **recursion**.
- Recursion is natural in math.
- Define \mathbb{N} , the set of all Natural Numbers.
 - 0 is in \mathbb{N} .
 - If i is in \mathbb{N} , $i + 1$ is in \mathbb{N} too.
 - The smallest set that satisfies the above two criteria is the set of all natural numbers.
- Some mathematical process does not have a closed form, and can only be defined via a recursive process.

Recursion

- ```
void countdown(int i){
 if(i >= 1){
 printf("%d\n", i); // print
 countdown(i - 1); //countdown from n-1
 }
}

void main(){
 countdown(3); //initiate the countdown
}
```

- Prints out 3 2 1.
- For each  $i > 0$  , it prints out  $i$  and continues to  
countdown with a smaller number  $i-1$  .

# Exercise

1. You have £1000 deposit in the bank.
2. For each year,
  - $\text{new balance} = \text{balance} + \text{balance} * 0.05$
3. How much money do you have after saving for 10 years?
  - What is the mathematical formula of the solution?
  - Solve the problem using for loop and the recursion.



# For loop

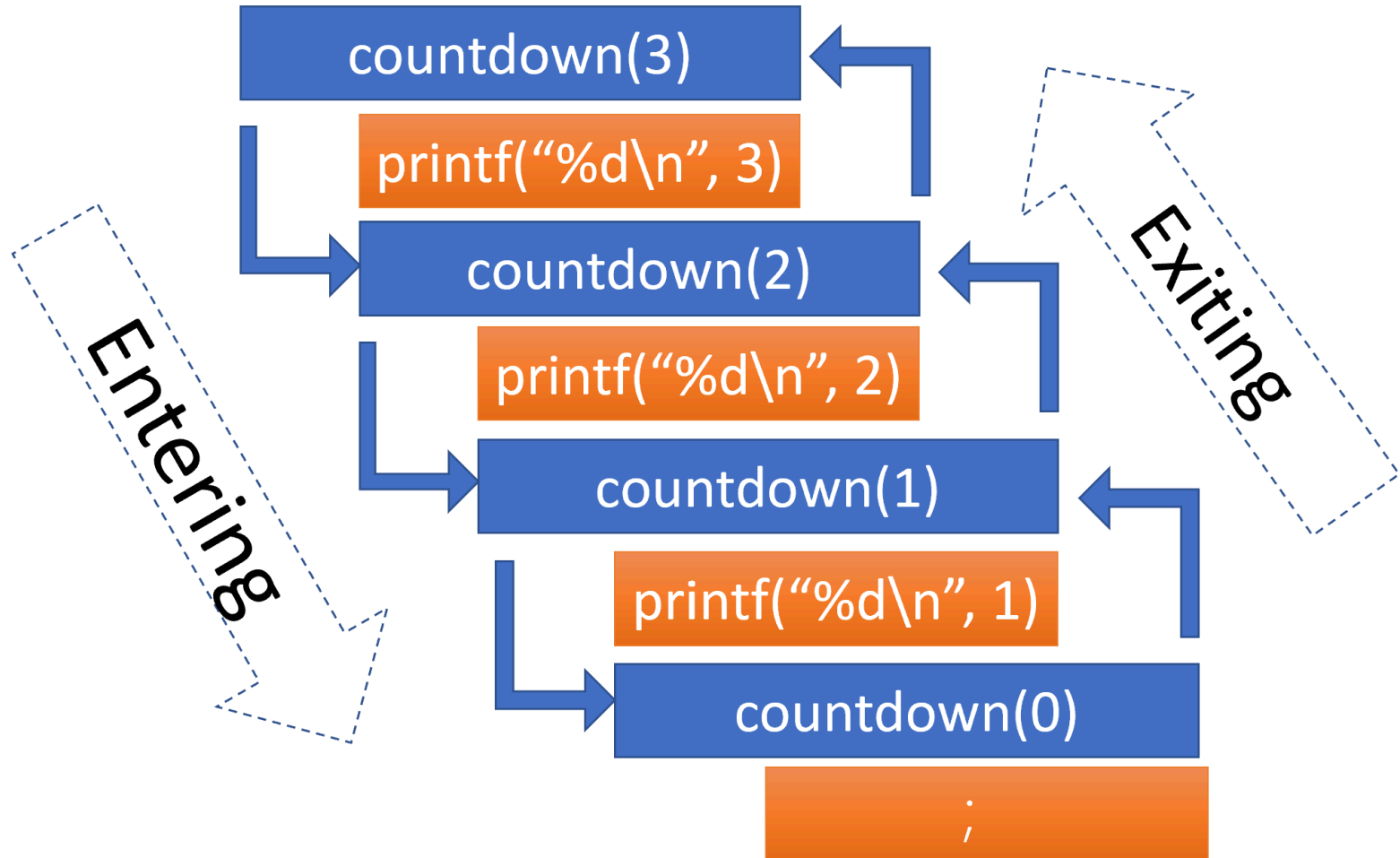
What is the initial condition?

How many times the loop will run?

# Recursion

- How to translate the problem into a recursive statement?
- Hint, express balance as a function of year, and the balance of the previous year.

# How does Recursion Work?



# How does Recursion Work?

```
void countdown(int i){
 printf("enter countdown(%d)\n", i); //new!
 if(i >= 1){
 printf("%d ", i);
 countdown(i - 1);
 }
 printf("exit countdown(%d)\n", i); //new!
}
```

```
enter countdown(3)
enter countdown(2)
enter countdown(1)
enter countdown(0)
exit countdown(0)
exit countdown(1)
exit countdown(2)
exit countdown(3)
```

# Conclusion

1. There can be multiple algorithms that solves the same computational task.
2. The computing cycles required for each algorithm is called time complexity.
3. The function definition that refers to itself is called recursion.

# Memory Allocation for Functions

- When the function is being executed on the CPU, its data (such as variables declared in the function) and code are temporarily stored in the memory.
- The memory region for storing function data in the current program is called "stack".

# Stack

- Stack is a data structure that the newest element is placed on top of the old elements.



# Stack Memory Allocation

1. When a function is called, its data and code is added to the top of the stack.
2. CPU can only access data and code from **the top stack**.
  - It means, CPU can only access variables from the current function that is being called!
3. When a function finishes its execution, its data is removed from the stack and the space it occupies is freed for future calls of functions.



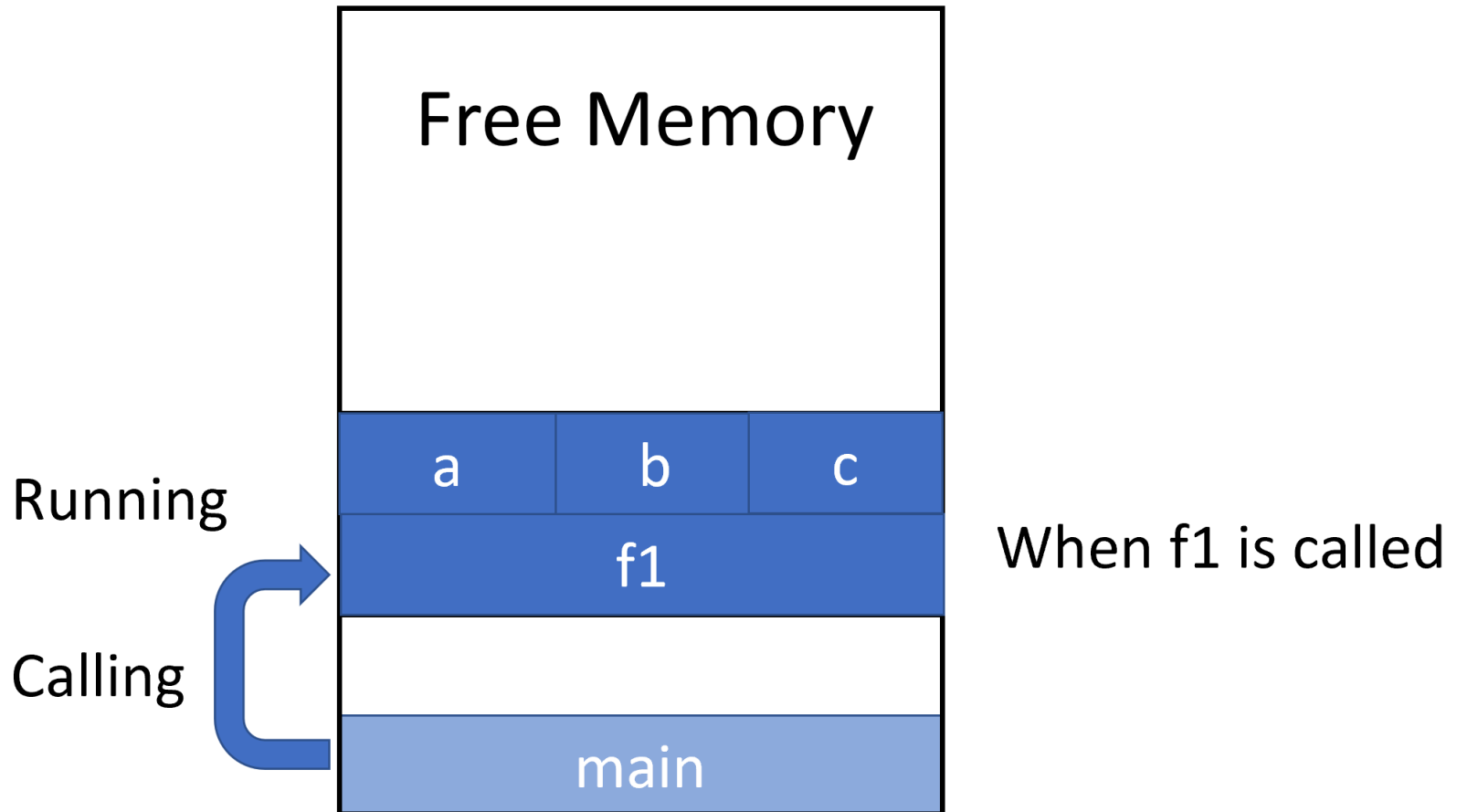
# Stack Memory Allocation

Consider a function `f1` calls `f2` and `f2` calls `f3` .

```
#include <stdio.h>
void f3(){
 int d = 6, e = 7;
};
void f2(){
 int a = 4, b = 5;
 f3();
}
void f1(){
 int a = 1, b = 2, c = 3;
 f2();
};
void main(){
 f1();
}
```

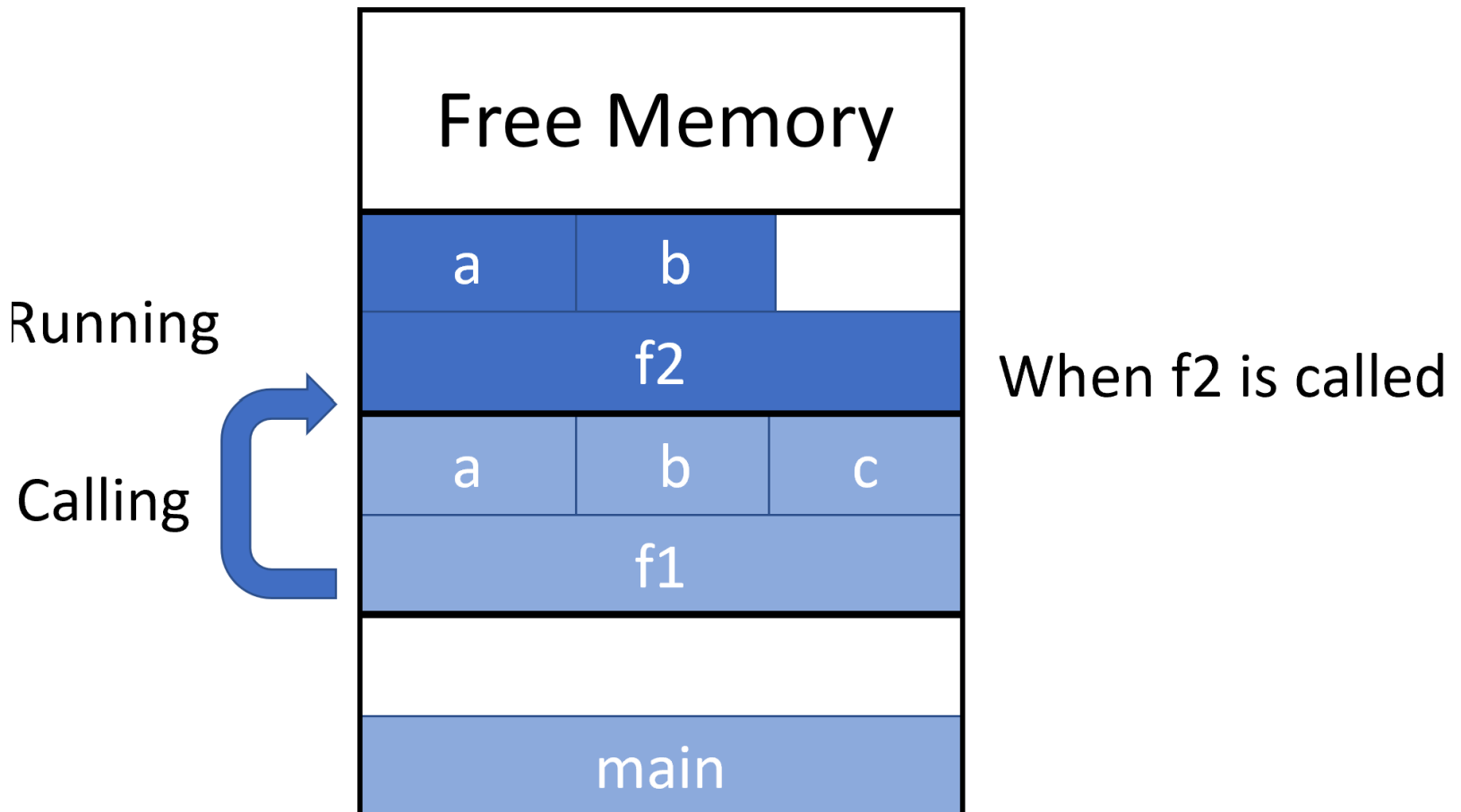
# Stack Memory Allocation

Below is the stack while `f1` is called.



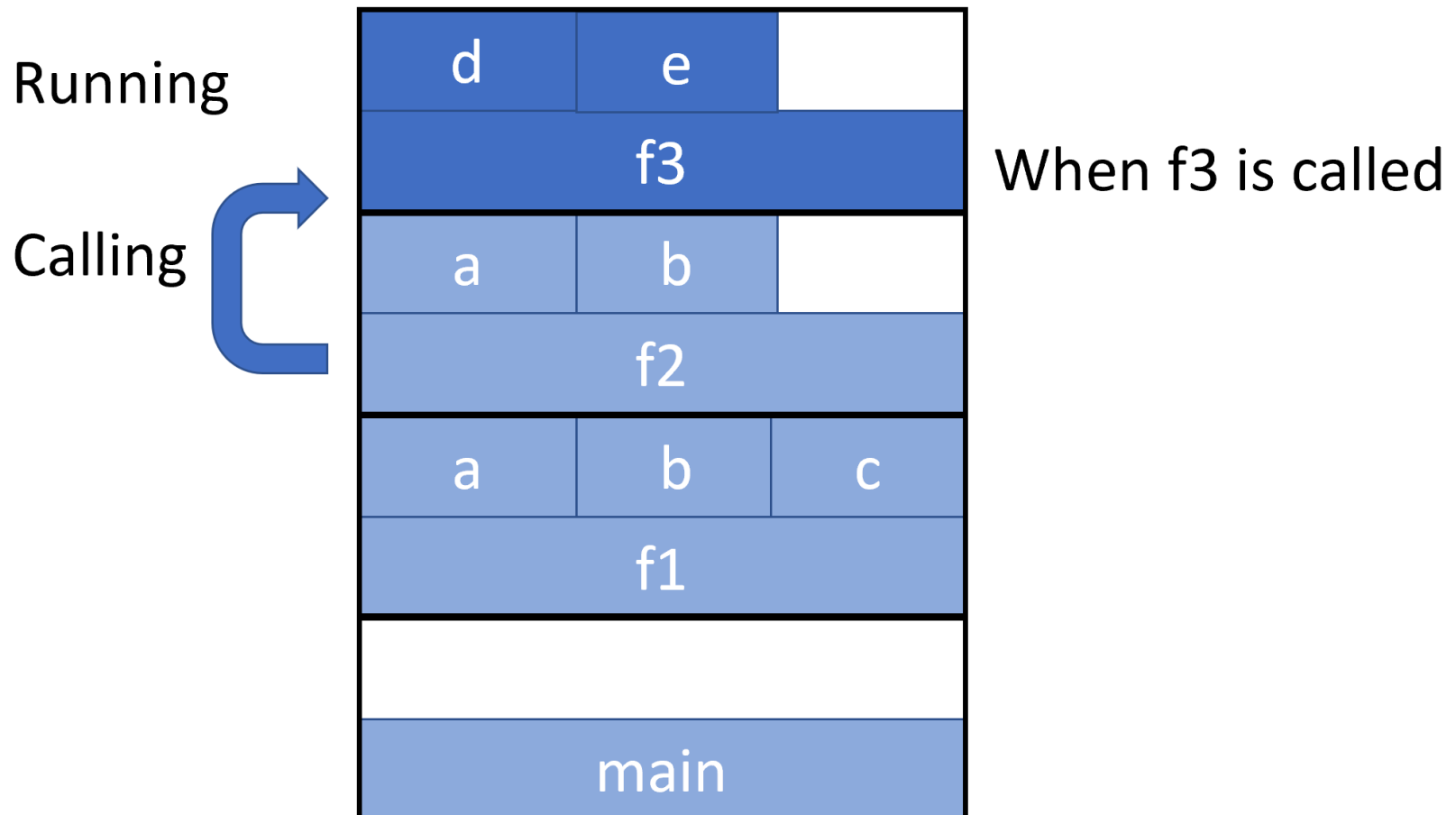
# Stack Memory Allocation

Below is the stack while `f2` is called.



# Stack Memory Allocation

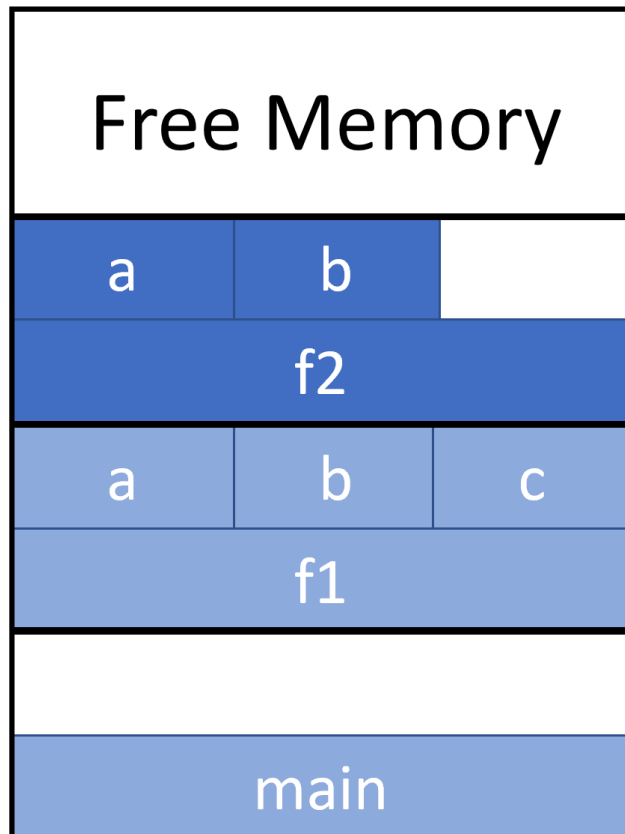
Below is the stack while `f3` is called.



# Stack Memory Release

Below is the stack while `f3` is finished.

f3 finished,  
memory freed

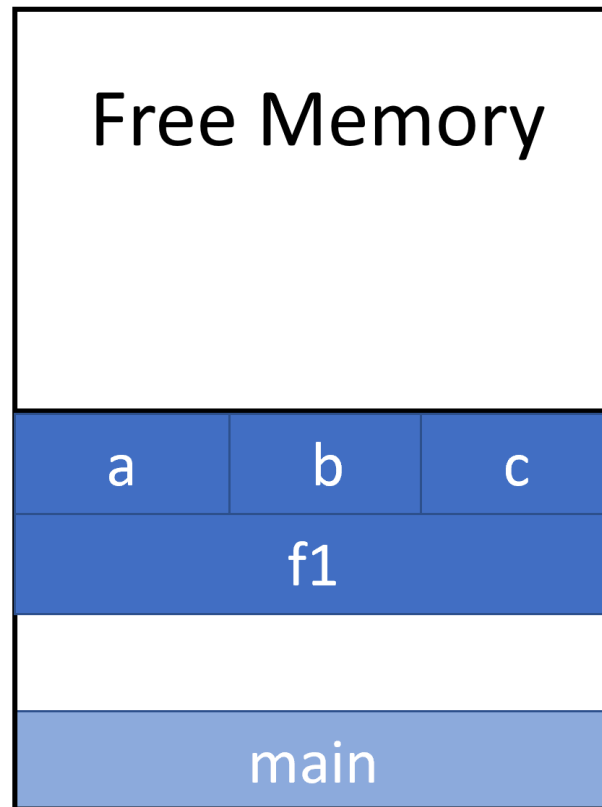


When f3 is finished

# Stack Memory Release

Below is the stack while `f2` is finished.

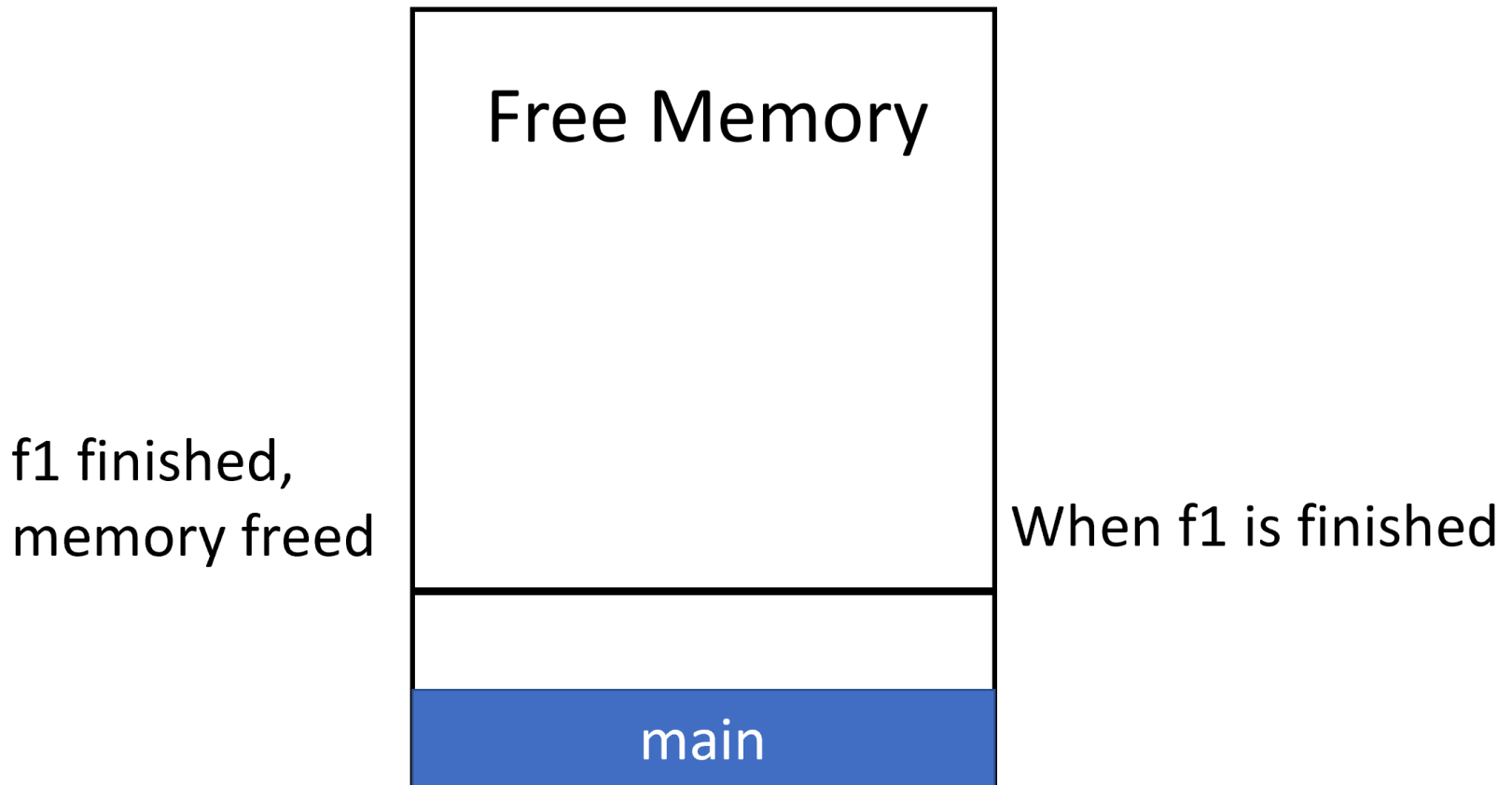
f2 finished,  
memory freed



When f2 is finished

# Stack Memory Release

Below is the stack while `f1` is finished.



# Local Variables

Variables declared inside the function are called **local variables** (This includes all input argument variables!).

- They can only be accessed by the function where it is defined.
  - They cannot be accessed by other functions.
- **Why?** The program can only access the top layer of the stack, which stores variables of the **running function**.
- In the "f1-f2-f3" example, your program cannot access `a` and `b` defined in `f1` while `f2` is running.



# Stack Memory Allocation

Stack is a highly efficient memory allocation/release mechanism.

- The memory allocation and release are all automatically handled by the OS.
- However, there is only a limited stack space for each program (determined by the OS). If a single function occupies a large memory space, or the call stack gets too "tall", we may run out of stack memory and a "runtime error" will be raised by the OS.
  - This out-of-memory error is called "[Stack Overflow](#)".

# Conclusion

- Function data and code are stored in stack memory.
  - i. Local variables can only be accessed by the function where it is defined.

# Homework 4.1

1. We are going to verify the time-complexity for different prime finding algorithms I introduced in the lecture.
2. Open `prime1.c`.
3. Slightly modify the code, so it prints out the number of elementary computing cycles (loop iterations) it has gone through in order to find all prime numbers  $\leq 100$ .
  - For example, in the **pseudo code** below, the outer loop repeats 10 times and the inner loop repeats 11 times, so the program will go through  $10 \cdot 11$  elementary computing cycles before it stops.

```
for i from 1 to 10
 for j from 1 to 11
 print out i*j
```

## Homework 4.2

1. Modify `prime2.c` and `prime3.c` and print out the number of elementary computing cycles.
2. Imagine a program that finds all prime numbers which are smaller than `n` by using the algorithm in `prime1.c`
  - Finding the formula for expressing of cycles executed by this program in terms of `n`.
  - Verify your formula using program.

## Homework 4.3 (Submit)

Suppose you have two matrices  $A \in \mathbb{R}^{m \times n}$ ,  $B \in \mathbb{R}^{n \times l}$ .

What is the time complexity of computing matrix multiplication  $AB$ ?

1. Express the number of computing cycles needed for this operation using  $m$ ,  $n$  and  $l$ .
2. If the it takes  $T$  seconds to compute  $AB$ , how much time would it take to compute  $CD$ ,  $C \in \mathbb{R}^{2m \times 2n}$ ,  $D \in \mathbb{R}^{2n \times 2l}$ .

Write your answer and reasoning in the submission text box on blackboard.

# Homework 4.3 (21-22 Exam Question)

```
#include <stdio.h>
void g(){
 int b = 4, c = 5;
 printf("g is being called!\n");
}
void f(){
 int a = 1, b = 2;
 g();
 printf("g has been called!\n");
}
void main(){
 f();
}
```

Without running the program, draw the stack memory layout (see lecture slides) when the program is printing out `g is being called!`. Verify your answer using debugger.

## Homework 4.4 (submit)

1. You have £1000 deposit in the bank.
2. For each year,
  - $\text{new balance} = \text{balance} + \text{interest}$
  - if  $\text{balance} \leq 1100$ ,  $\text{interest} = \text{balance} * 0.05$
  - if  $\text{balance} > 1100$ ,  $\text{interest} = 100 * 0.05 + (\text{balance} - 1100) * 0.02$
3. How much money do you have after saving for 10 years?
  - Solve the problem using recursion.

## Homework 4.4 (submit)

Hint: How do you express balance as a function year?

- if  $y = 0$ . then  $\text{balance} = 1000$
- $\text{balance}(y) = \text{balance}(y-1) + \dots ?$

Write your code in `deposit.c` and submit.