



Safe Memory-Leak Fixing for C Programs

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内存管理

- 安全攸关软件的开发必然涉及内存管理问题
- 软件工程经典问题，数千篇论文
- 垃圾回收
 - 广泛用于Java, Go等大量新语言
 - 通过动态扫描内存发现需要回收的内存





垃圾回收 vs 安全攸关软件

- 大量系统资源无法通过垃圾回收管理
 - 文件句柄、线程锁等
- 在安全攸关软件中，内存对象常常也无法通过垃圾回收管理
 - 实时嵌入式系统，运行资源有限
 - 大数据处理系统，垃圾收集耗时过长
 - 处理数据量达到10G时，垃圾收集运行时间占程序运行总时间一半以上





内存泄露的例子

```
1 #include <stdlib.h>
2 #include <stdio.h>
3
4 void f(int *p, int **q){
5     *q = p;
6 }
7 void g(int *p){
8     free(p);
9 }
10 int h(int size, int num, int sum){
11     int *p = (int*)malloc(sizeof(int)*size);
12     int **q = (int**)malloc(sizeof(int*));
13     if (size == 0)
14         q(p);
15     else
16         for (int i = 0; i < size; ++i)
17             if (p[i] != num){
18                 f(p, q);
19                 sum += (*q)[i];
20             }
21     else
22         return i;
23     printf("%d", sum);
24     return sum;
25 }
```

内存分配 ← 11-12

内存释放 ← 14

内存使用 ← 17-19

泄露 ← 22

泄露 ← 24



内存泄露的例子

```
1 #include <stdlib.h>
2 #include <stdio.h>
3
4 void f(int *p, int **q){
5     *q = p;
6 }
7 void g(int *p){
8     free(p);
9 }
10 int h(int size, int num, int sum){
11     int *p = (int*)malloc(sizeof(int)*size);
12     int **q = (int**)malloc(sizeof(int*));
13     if (size == 0)
14         free(q);
15     else
16         for (int i = 0; i < size; ++i)
17             if (p[i] != num){
18                 f(p, q);
19                 sum += (*q)[i];
20             }
21     else
22         return i;
23     printf("%d", sum);
24     return sum;
25 }
```



修复内存泄露仍是难题

- 需要考虑多个条件
 - 内存释放前必须已分配
 - 内存释放时必须有能从栈上访问的路径
 - 在任意路径上，内存不能被释放两次
 - 在任意路径上，内存使用前不能被释放
- 漏掉任何一条都将导致致命错误
- 实践中，常常出现发现内存泄露但不敢修改的情况



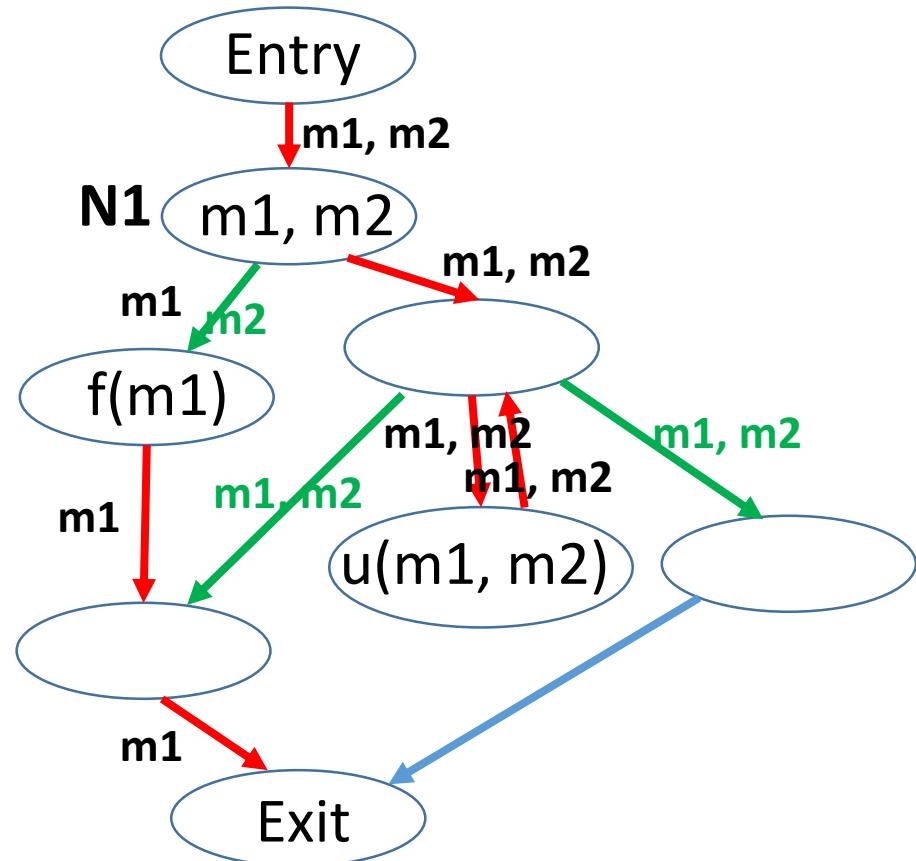
研究成果：自动内存修复技术

- 通过对C程序代码的分析，自动查找内存泄露并修复
- 保证修复的绝对正确性
 - 对于任意插入的free语句和任意执行路径
 - 释放前分配：在执行到free之前所指的内存已经分配
 - 无双重释放：在该路径上没有任何其他free语句释放同一块内存
 - 无释放后使用：在该free之后所释放内存不能再被使用
- 能在较短时间内完成对大型程序的分析工作
- 论文已经被软件工程顶级会议ICSE'15接收



背景：数据流分析

- 标准编译技术
- 通过遍历控制流图，给结点附上分析结果
- 保证分析的安全性
 - 分析结果一定是最真实结果的子集或超集





技术路线和创新

- 反复使用数据流分析



- 处理各种复杂情况

- 循环、全局变量、多重分配、空指针判断等问题

- 在一定程度上，用数据流分析的效率达到了路径敏感分析的效果



Defining a safe fix

- A fix consists of two components
 - A location to insert a free invocation
 - The expression to be used in the free invocation



An Example

```
1 void f(int b){  
malloc ← 2 int p=(int*)malloc(sizeof(int));  
3 if (b==0){  
free ← 4 free(p);  
5 }  
6 else{  
use ← 7 *p=1;  
8 b=0;  
9 }  
10 }
```



An Example

```
1 void f(int b){  
1   2   int p=(int*)malloc(sizeof(int));  
2   3   if (b==0){  
3   4       free(p);  
4   5   }  
5   6   else{  
5   7       *p=1;  
6   8       b=0;  
7   9   }  
8  10 }
```



An Example

```
1 void f(int b){  
1 └─→ 2 int p=(int*)malloc(sizeof(int));  
3     if (b==0){  
4         free(p);  
5     }  
6     else{  
7         *p=1;  
8         b=0;  
9     }  
10 }
```

1: no allocation, no expression to use in *free()*



An Example

```
1 void f(int b){  
2     int p=(int*)malloc(sizeof(int));  
2 → 3     if (b==0){  
4         free(p);  
5     }  
6     else{  
7         *p=1;  
8         b=0;  
9     }  
10 }
```

2: double free, use after free



An Example

```
1 void f(int b){  
2     int p=(int*)malloc(sizeof(int));  
3     if (b==0){  
4         free(p);  
5     }  
6     else{  
7         *p=1;  
8         b=0;  
9     }  
10 }
```

Red arrows point from the numbers 3, 4, and 8 to the corresponding lines of code: line 3 points to the if statement, line 4 points to the free(p) call, and line 8 points to the closing brace of the else block.

3,4,8: double free



An Example

```
1 void f(int b){  
2     int p=(int*)malloc(sizeof(int));  
3     if (b==0){  
4         free(p);  
5     }  
6     else{  
5 →    7         *p=1;  
8         b=0;  
9     }  
10 }
```

5: use after free



An Example

```
1 void f(int b){  
2     int p=(int*)malloc(sizeof(int));  
3     if (b==0){  
4         free(p);  
5     }  
6     else{  
7         *p=1;  
6      8         b=0;  
7      9     }  
10 }
```

6,7: safe fix locations



An Example

```
1 void f(int b){  
2     int p=(int*)malloc(sizeof(int));  
3     if (b==0){  
4         free(p);  
5     }  
6     else{  
7         *p=1;  
6     →     b=0;  
7     →     }  
10 }
```

6,7: both have pointers to the allocated memory object



An Example

```
1 void f(int b){  
2     int p=(int*)malloc(sizeof(int));  
3     if (b==0){  
4         free(p);  
5     }  
6     else{  
7         *p=1;  
6          b=0;  
7          }  
10 }
```

6 is earlier than 7



An Example

- Fix statement at line 6: free(p);

```
1 void f(int b){  
2     int p=(int*)malloc(sizeof(int));  
3     if (b==0){  
4         free(p);  
5     }  
6     else{  
7         *p=1;  
6     → 8         b=0;  
7     → 9     }  
10 }
```

6 is earlier than 7



A safe fix

- The fix is after an allocation
- There is no double free
- There is no use after free
- There is an expression that always points to the allocation



A safe fix

- The fix is after an **allocation**
- There is no double **free**
- There is no **use after free**
- There is an **expression** that always points to the **allocation**

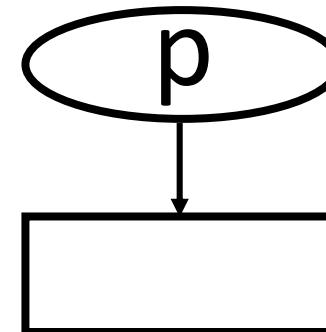


Memory-related elements

```
1 void f(int b){  
    int p=(int*)malloc(sizeof(int));  
    if (b==0) {  
        free(p);  
    }  
    else{  
        *p=1;  
        b=0;  
    }  
}
```

malloc ← 2 Must allocation
free ← 4 May free
use ← 7 May use

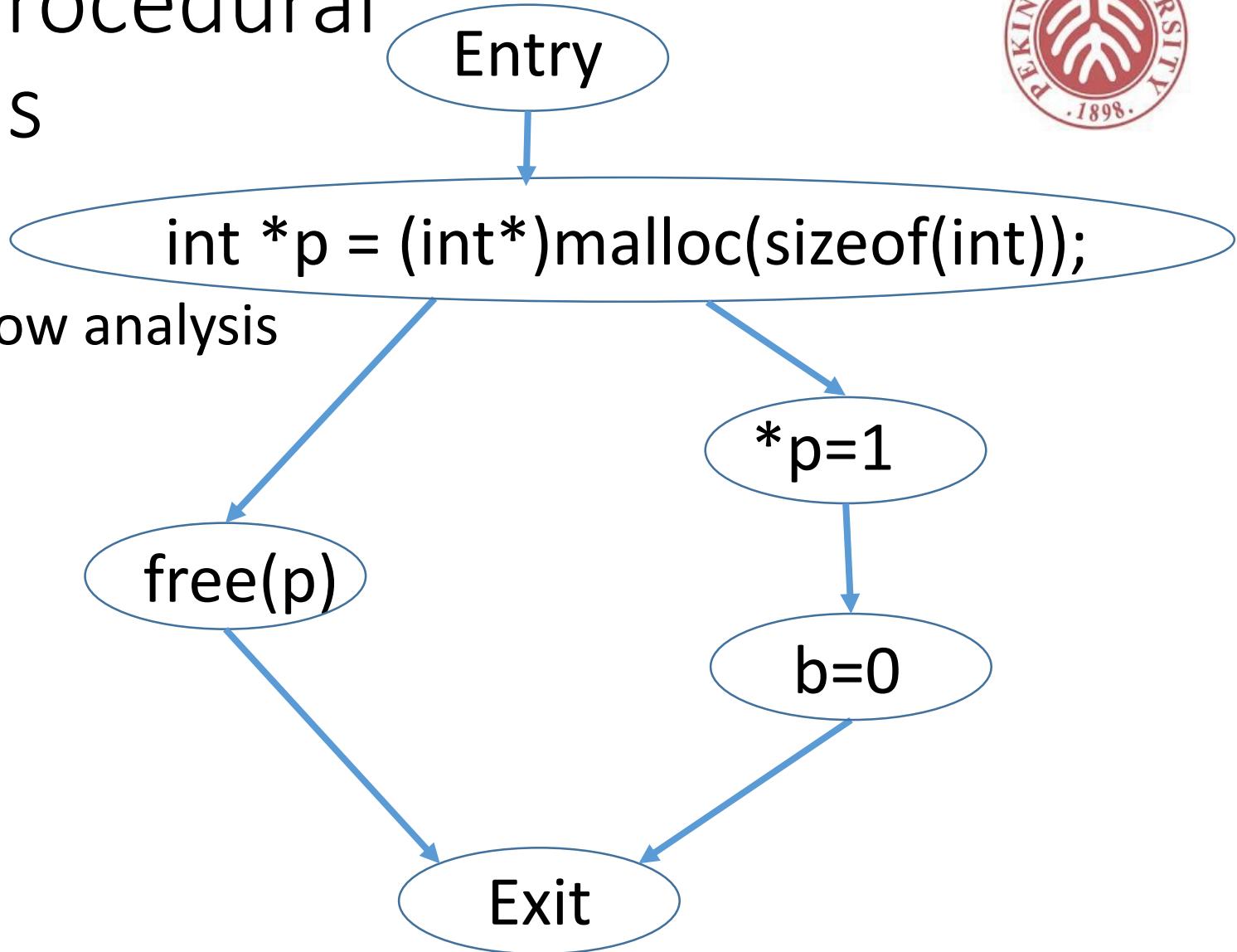
Points-to Graph





Intra-procedural analysis

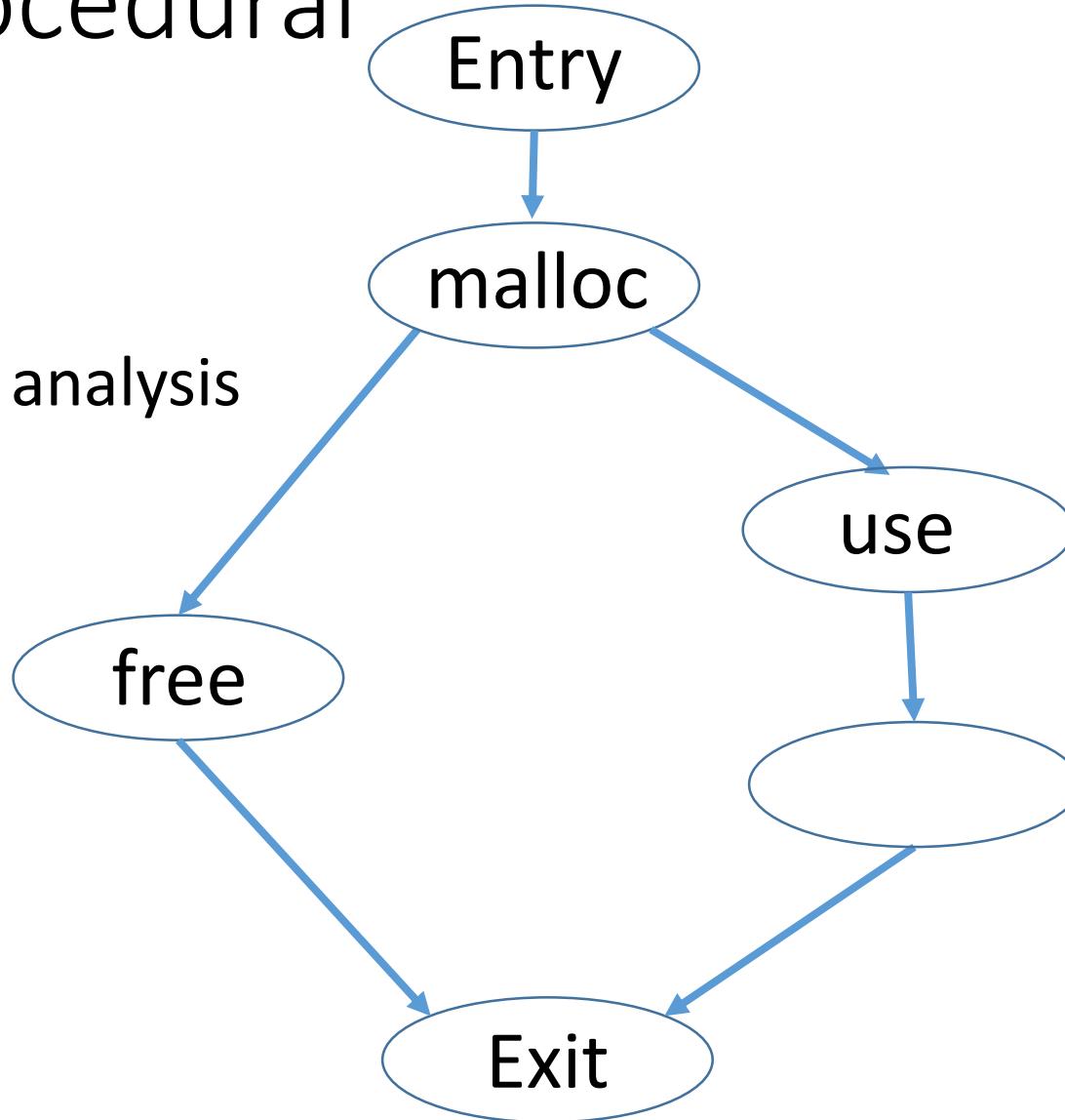
- Data-flow analysis





Intra-procedural analysis

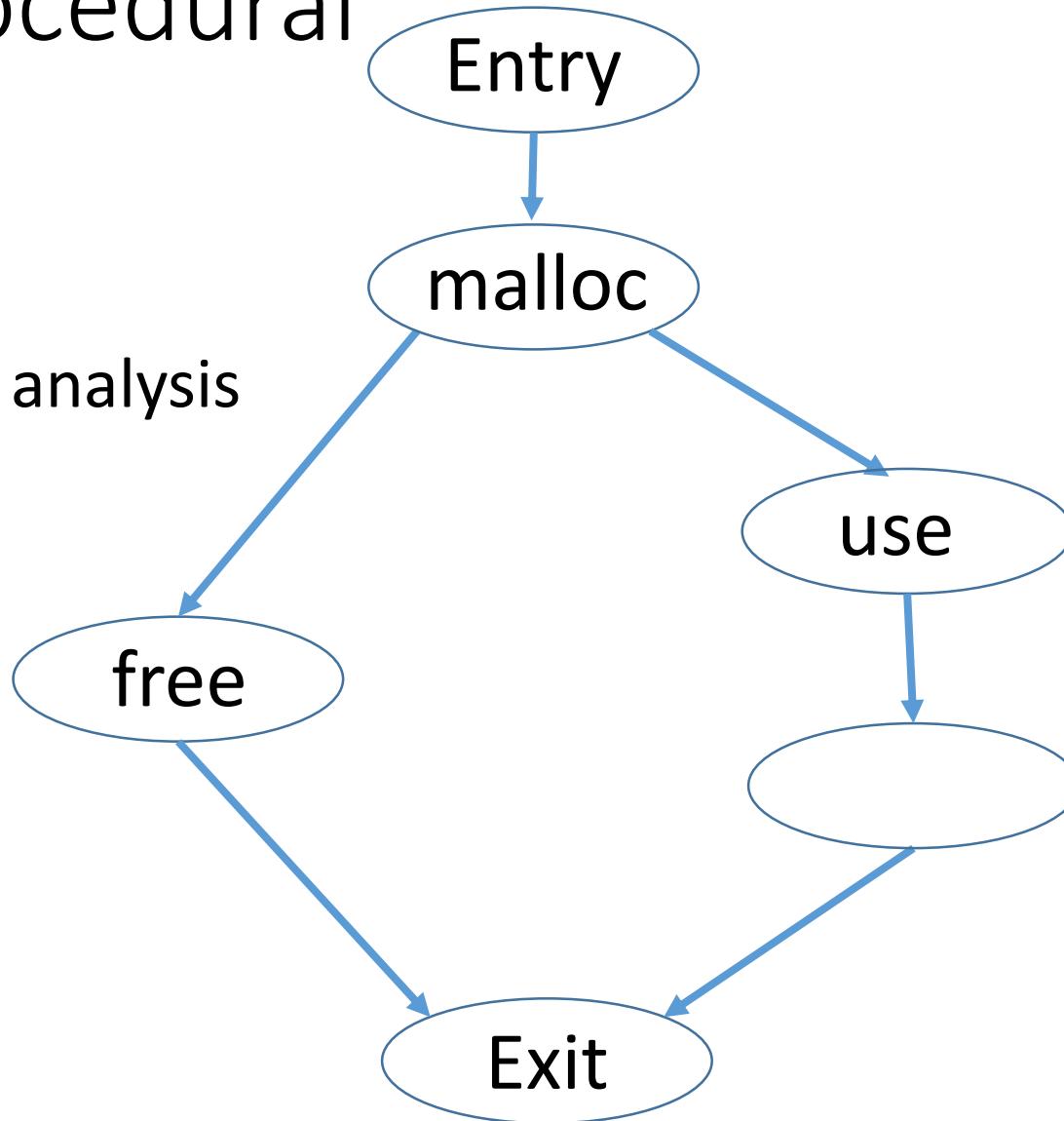
- Data-flow analysis





Intra-procedural analysis

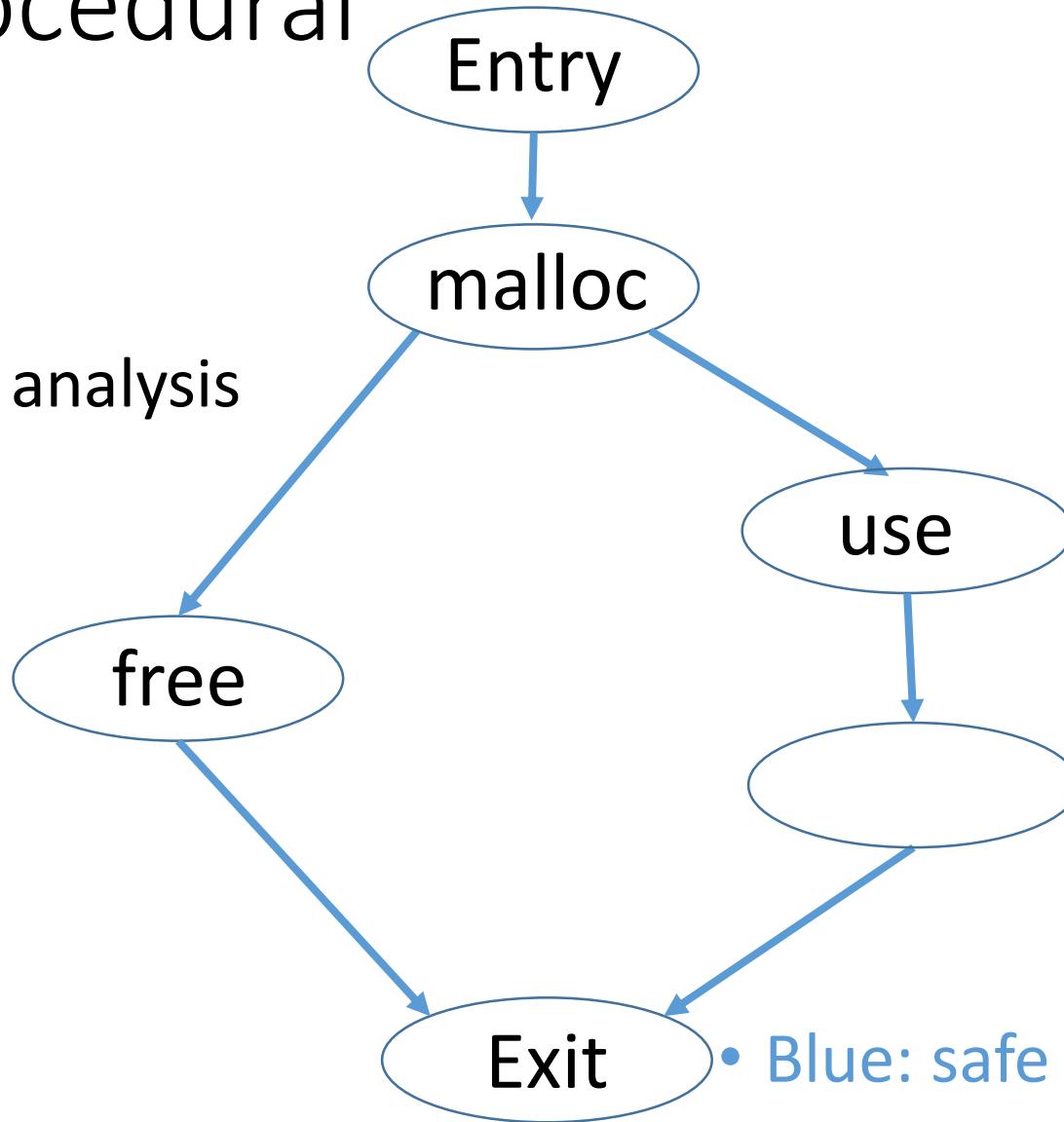
- Data-flow analysis
- 4 steps





Intra-procedural analysis

- Data-flow analysis
- 4 steps

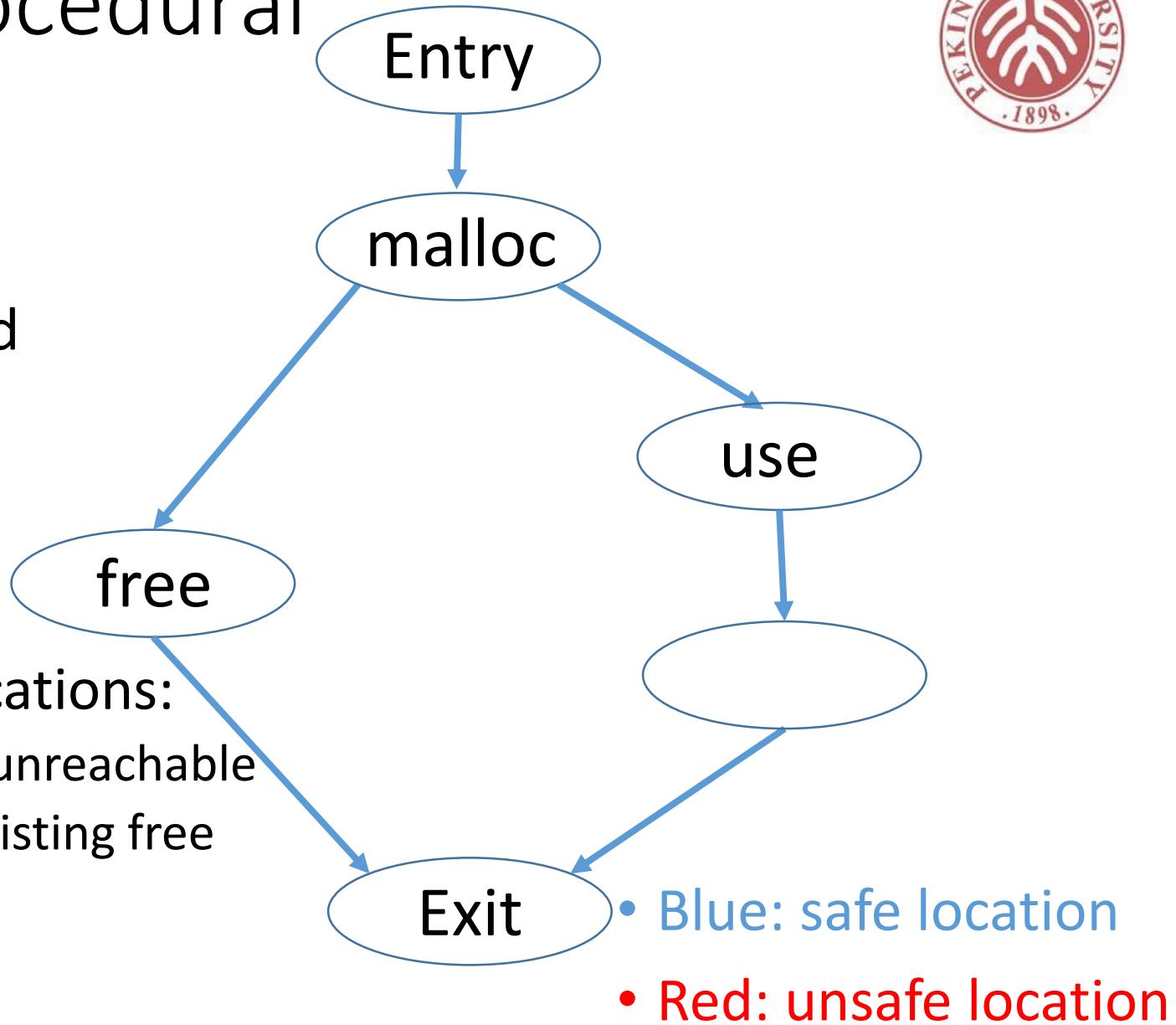


- Blue: safe location
- Red: unsafe location



Intra-procedural analysis

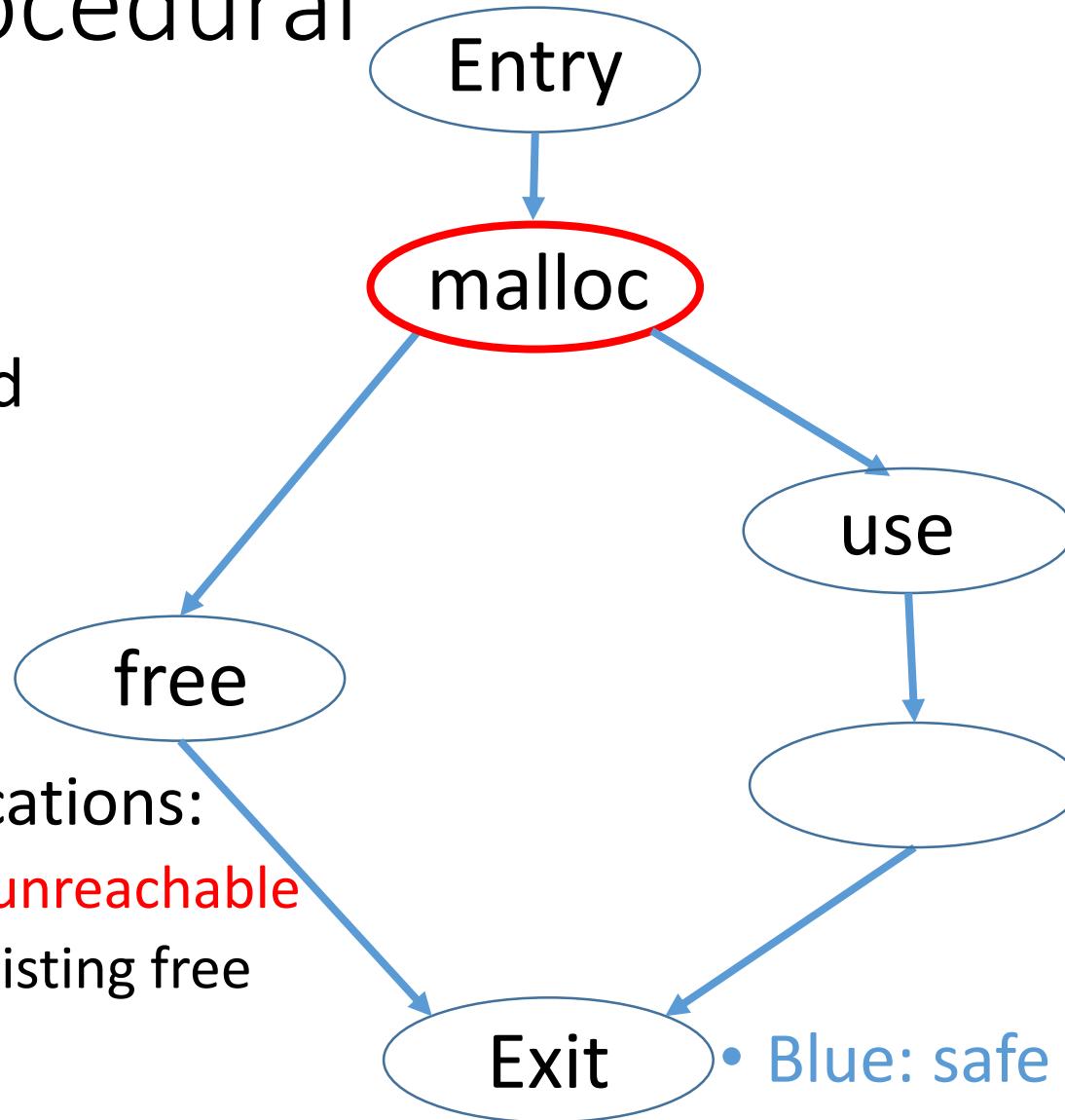
- 1. Forward





Intra-procedural analysis

- 1. Forward



- unsafe locations:

- Malloc unreachable
- After existing free

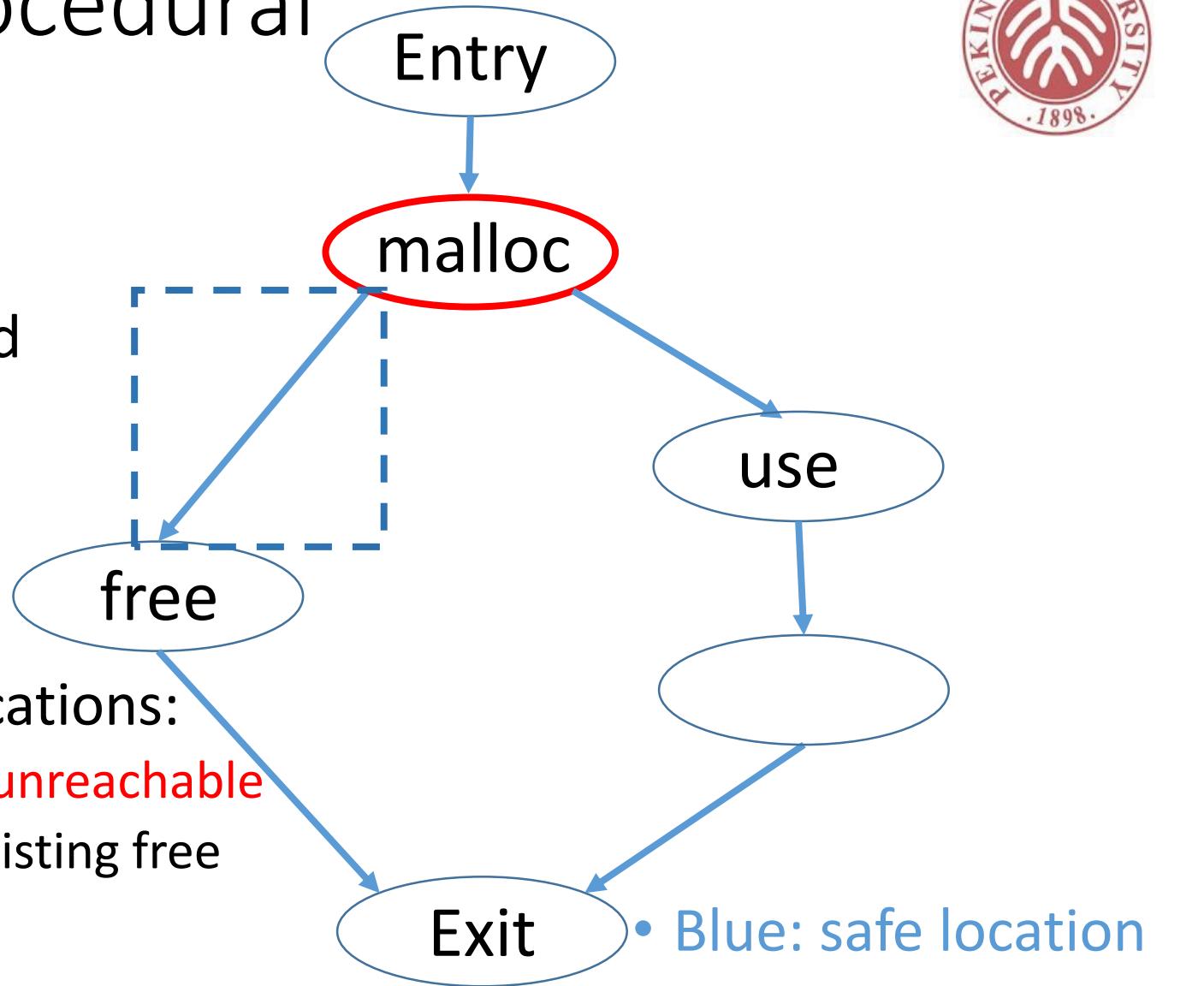
- Blue: safe location
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The fix is after an allocation



Intra-procedural analysis

- 1. Forward



- unsafe locations:

- Malloc unreachable
- After existing free

- Blue: safe location
- Red: unsafe location

The fix is after an allocation

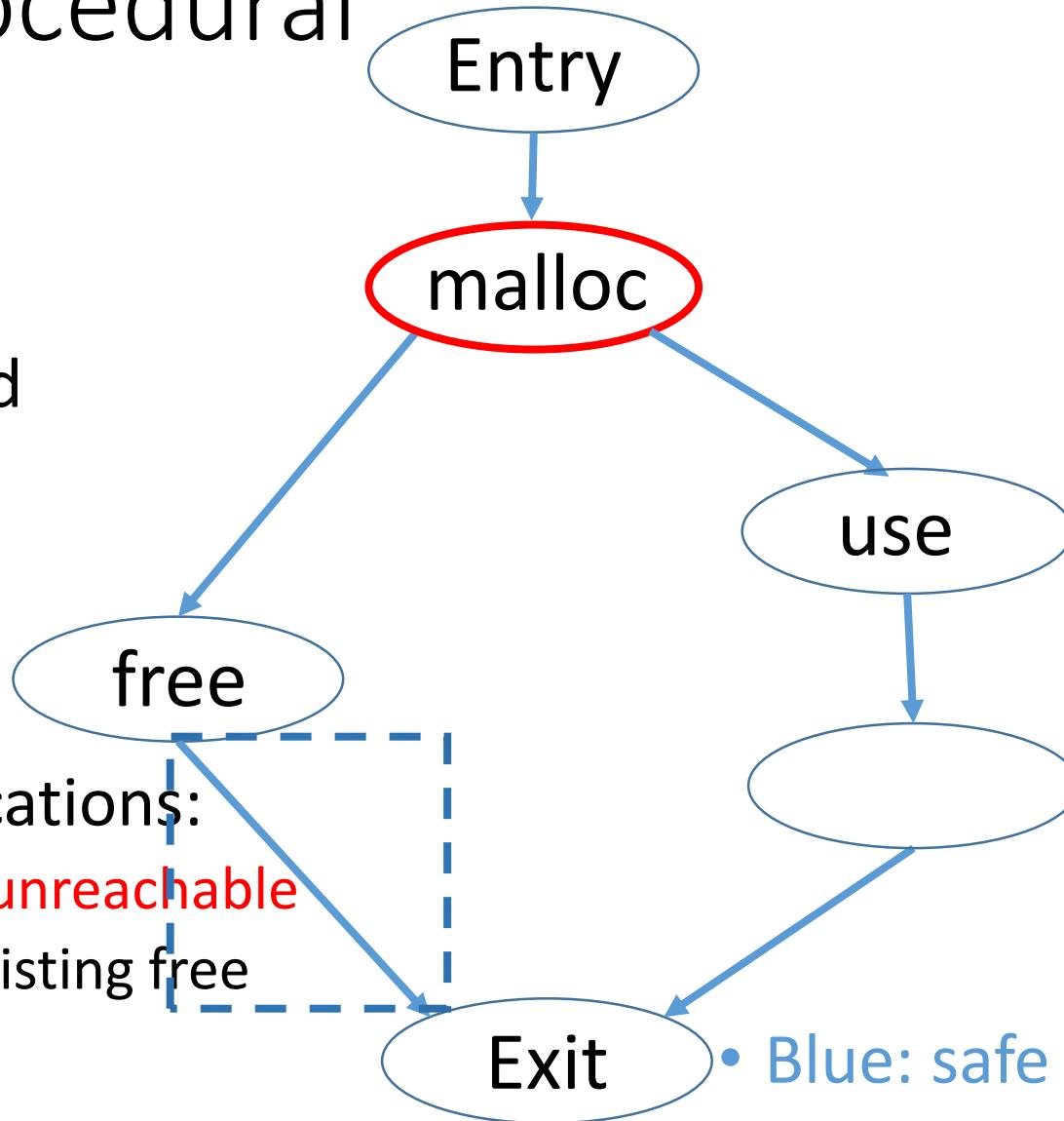


Intra-procedural analysis

- 1. Forward

- unsafe locations:

- Malloc unreachable
- After existing free



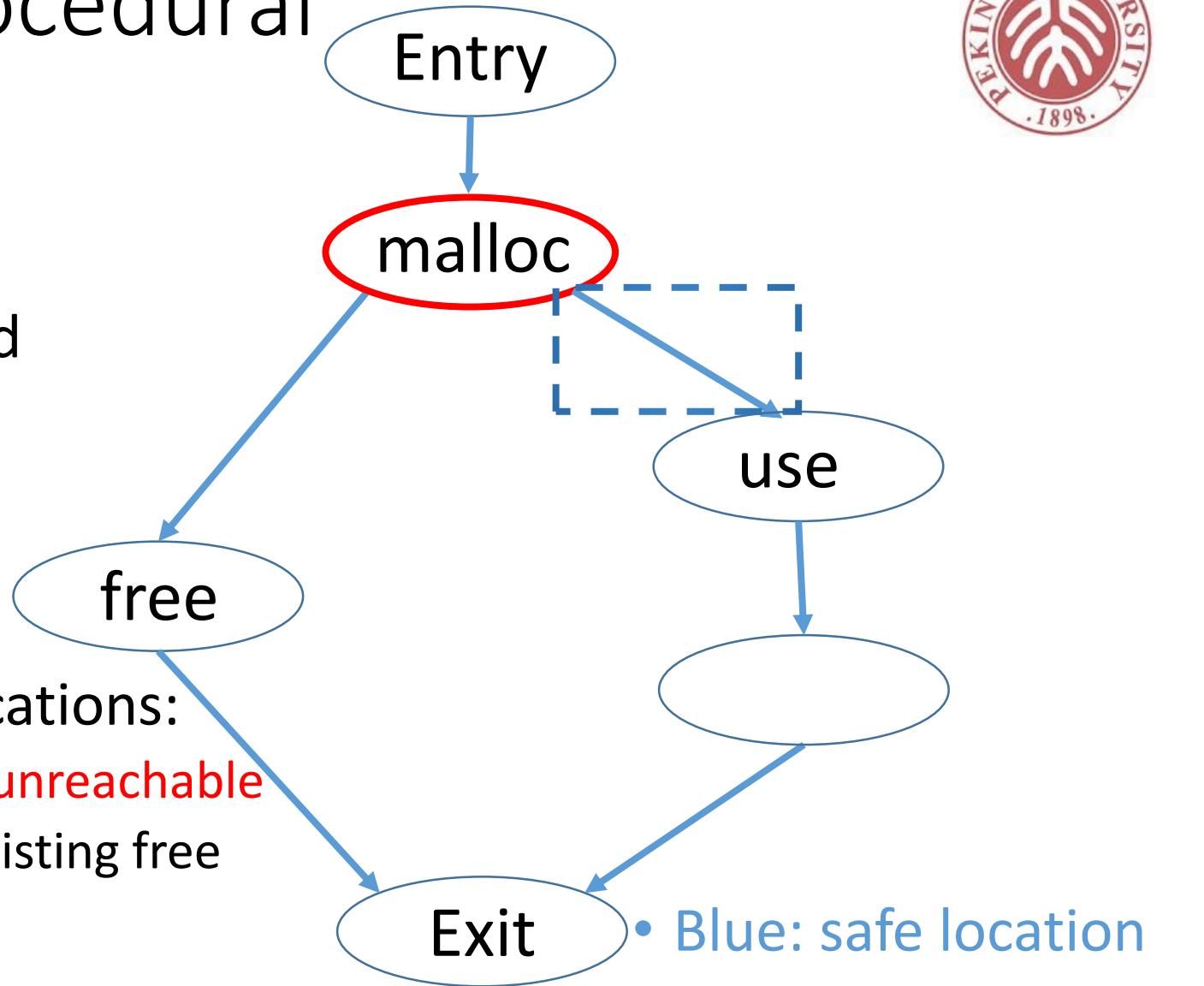
- Blue: safe location
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The fix is after an allocation



Intra-procedural analysis

- 1. Forward



- unsafe locations:

- Malloc unreachable
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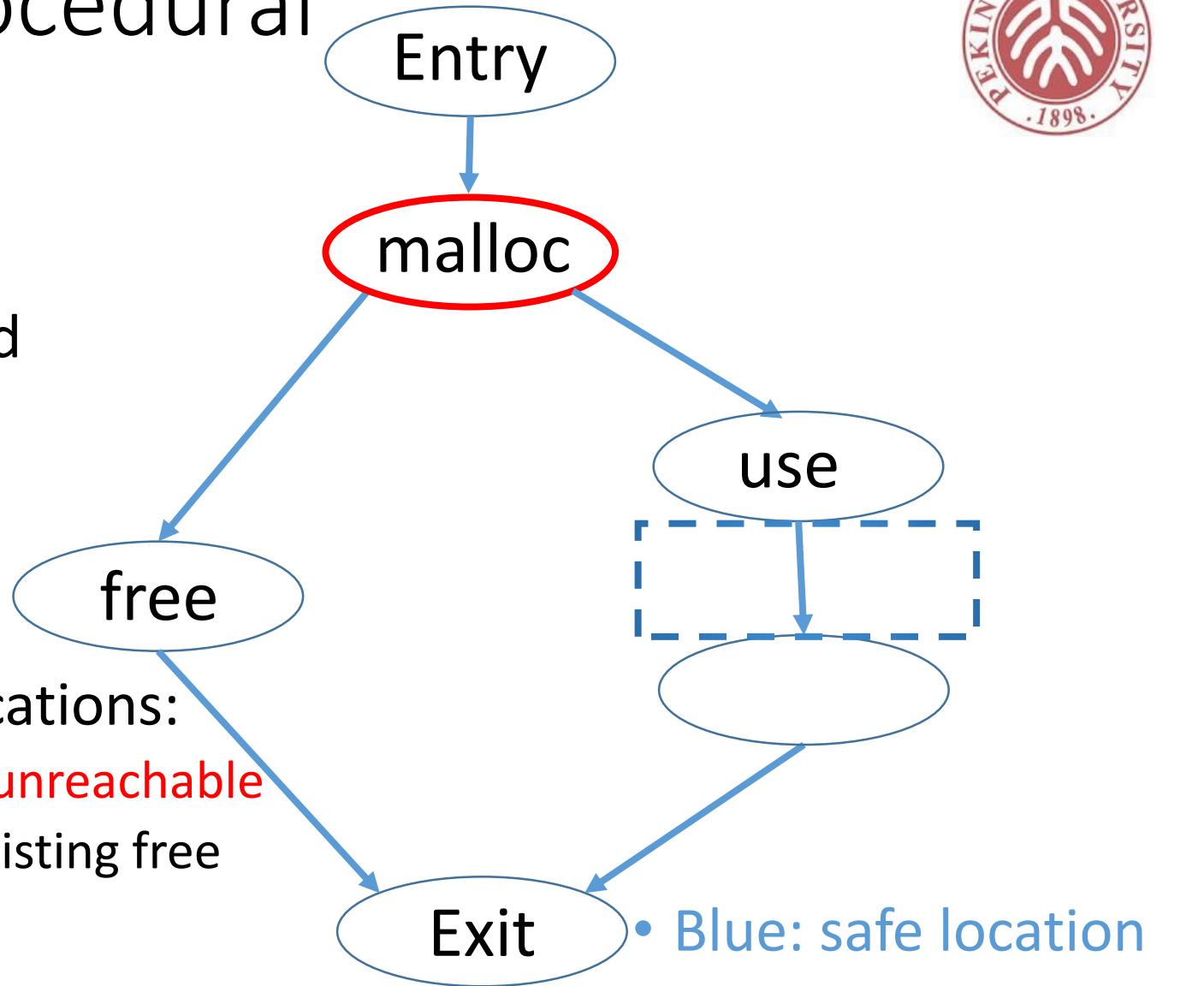
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Intra-procedural analysis

- 1. Forward



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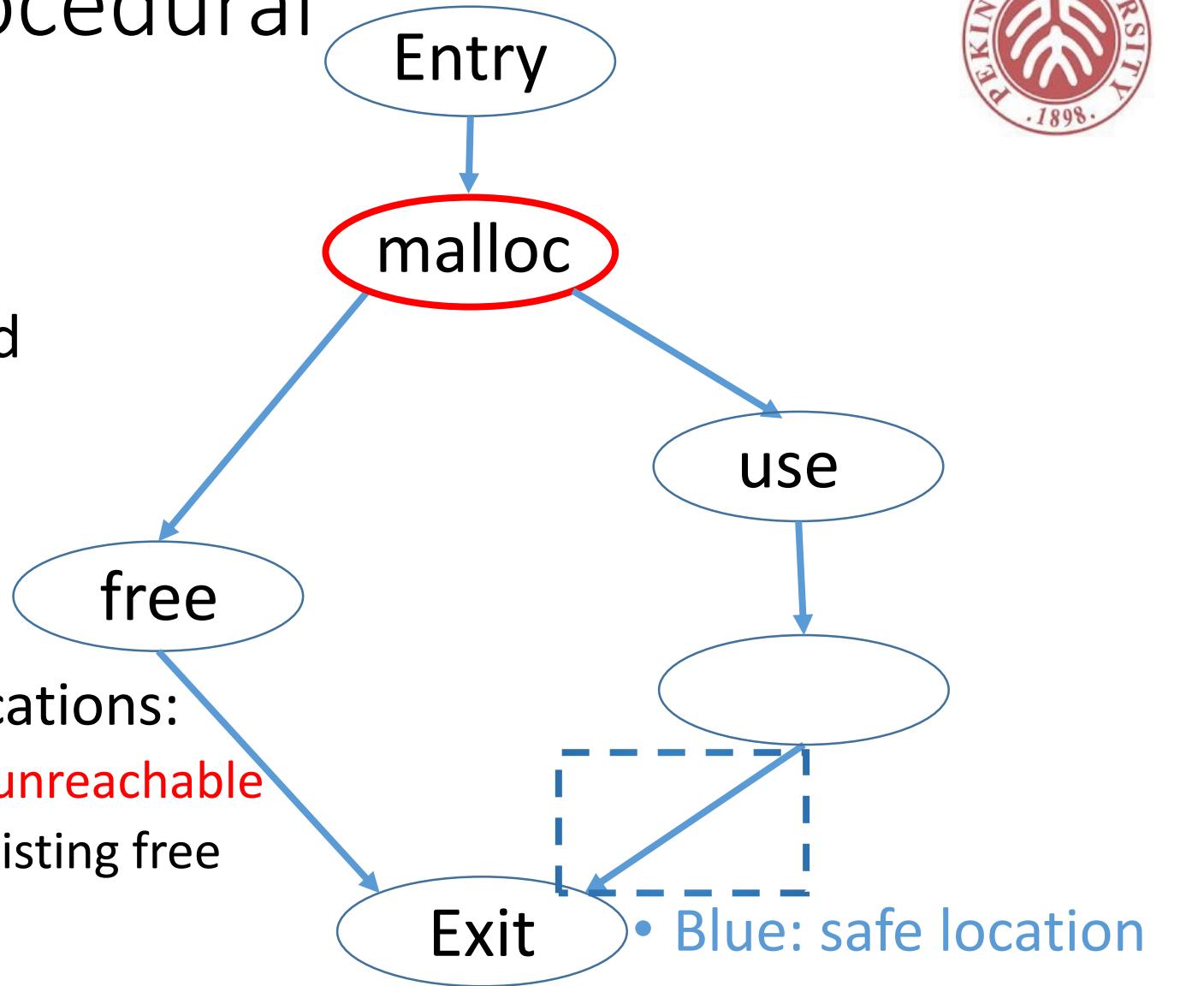


Intra-procedural analysis

- 1. Forward

- unsafe locations:

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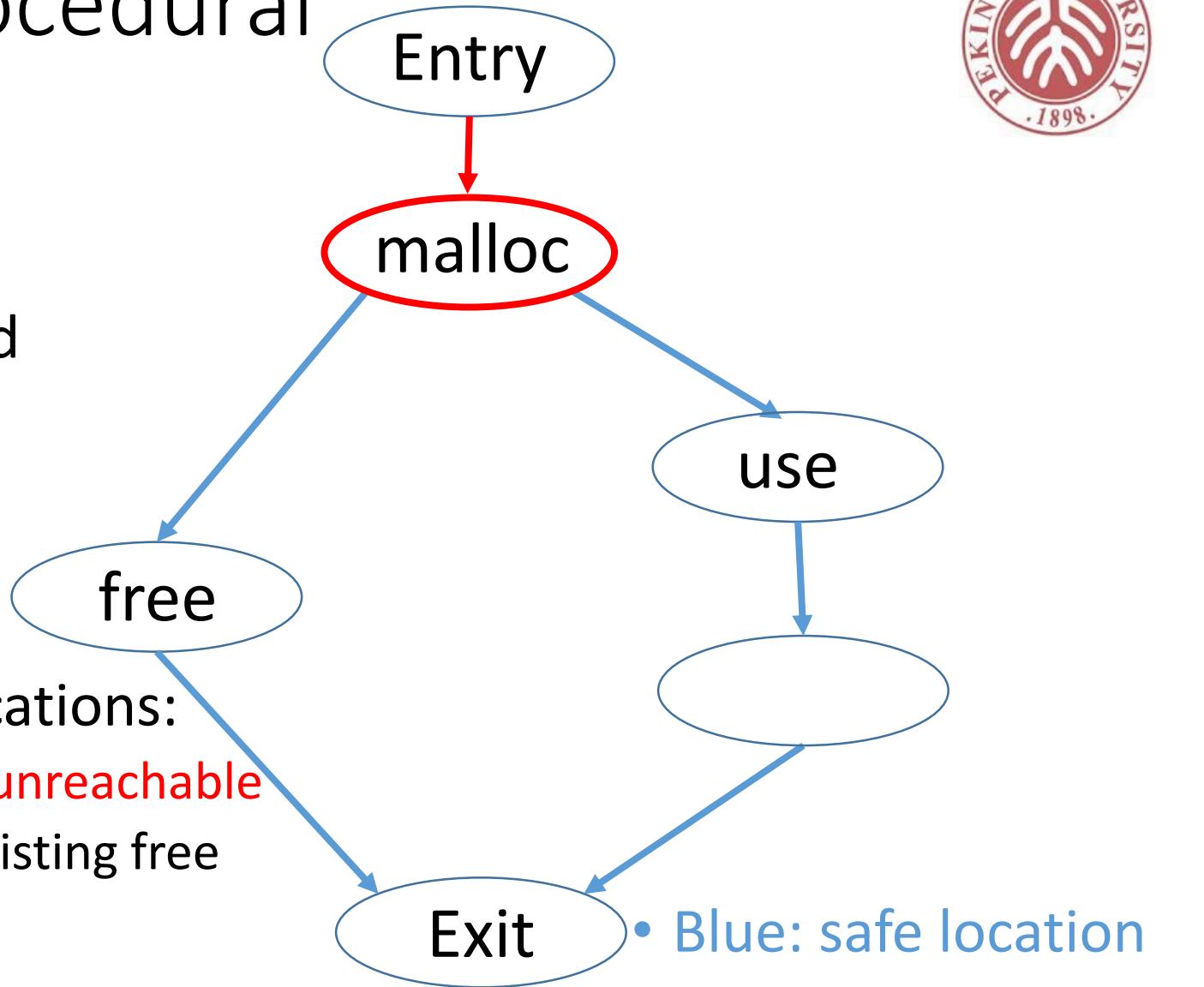
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The fix is after an allocation



Intra-procedural analysis

- 1. Forward



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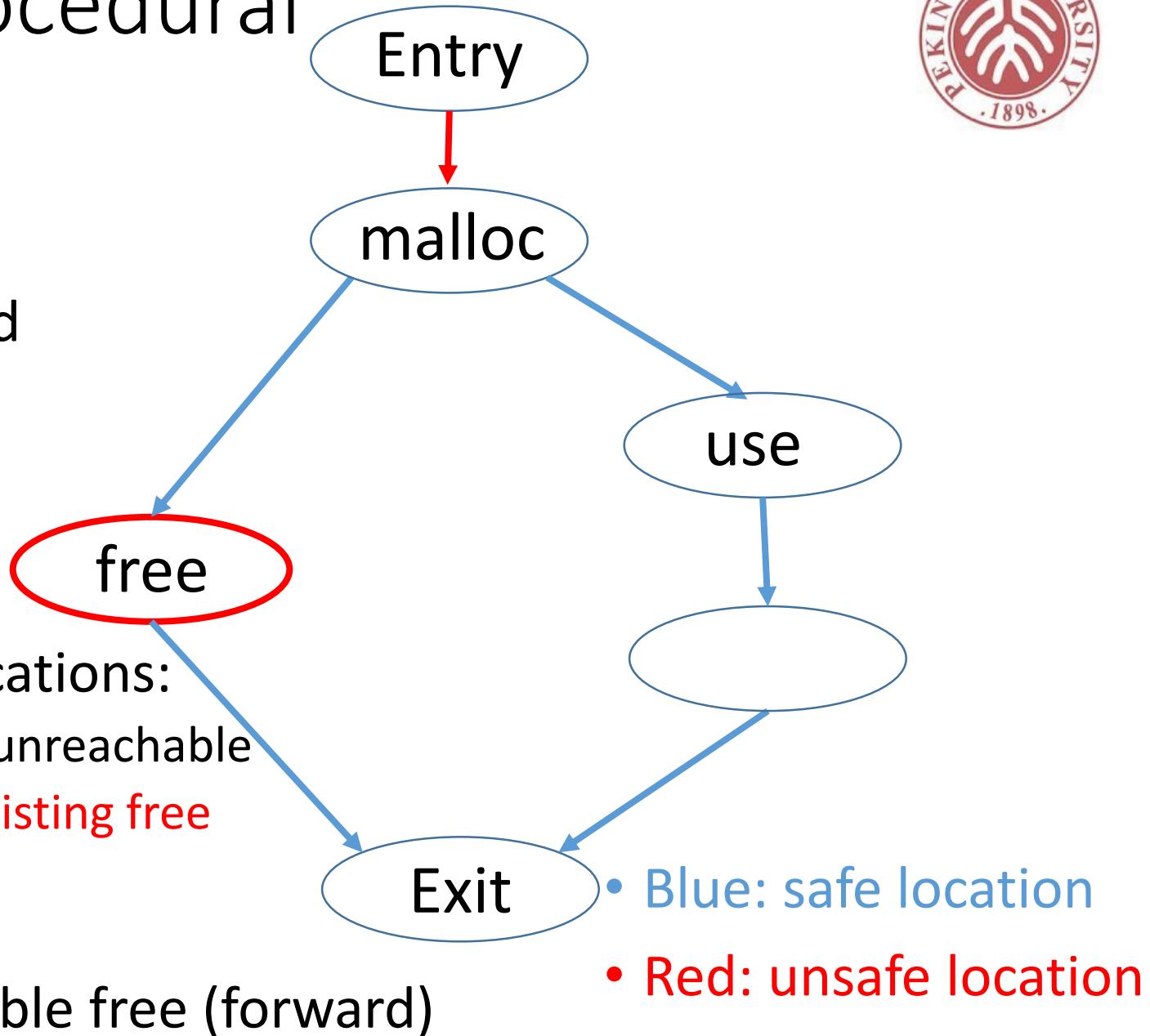
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- Red: unsafe location

The fix is after an allocation



Intra-procedural analysis

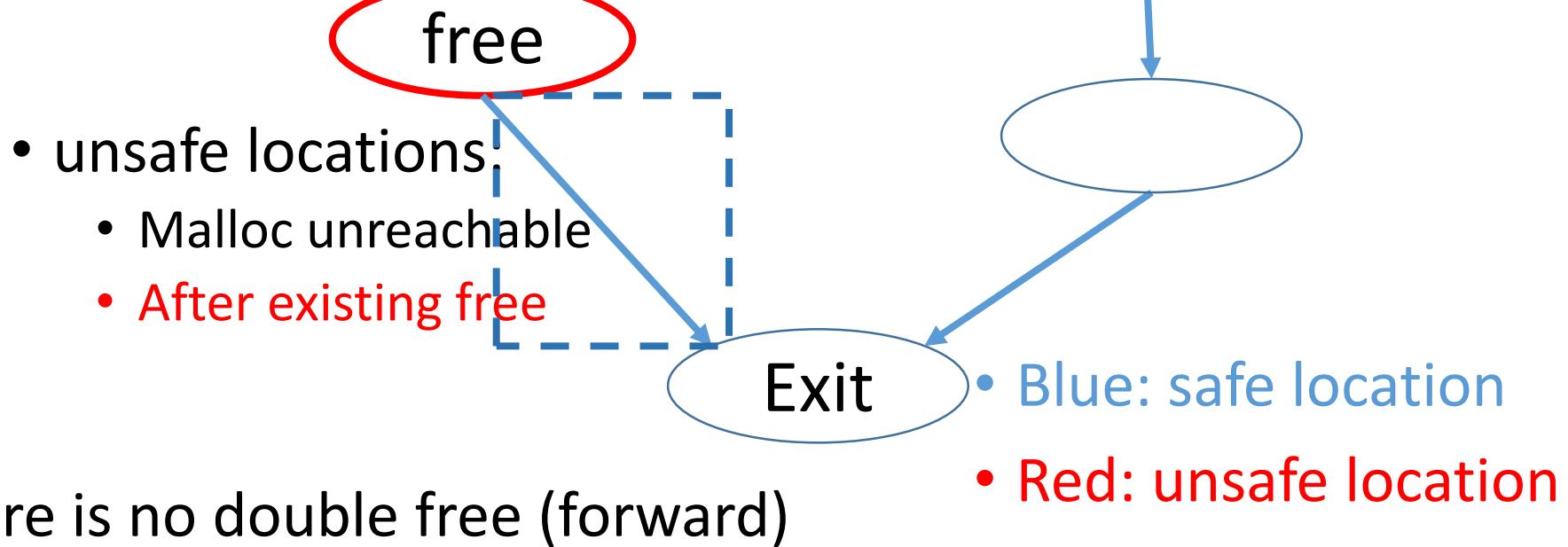
- 1. Forward





Intra-procedural analysis

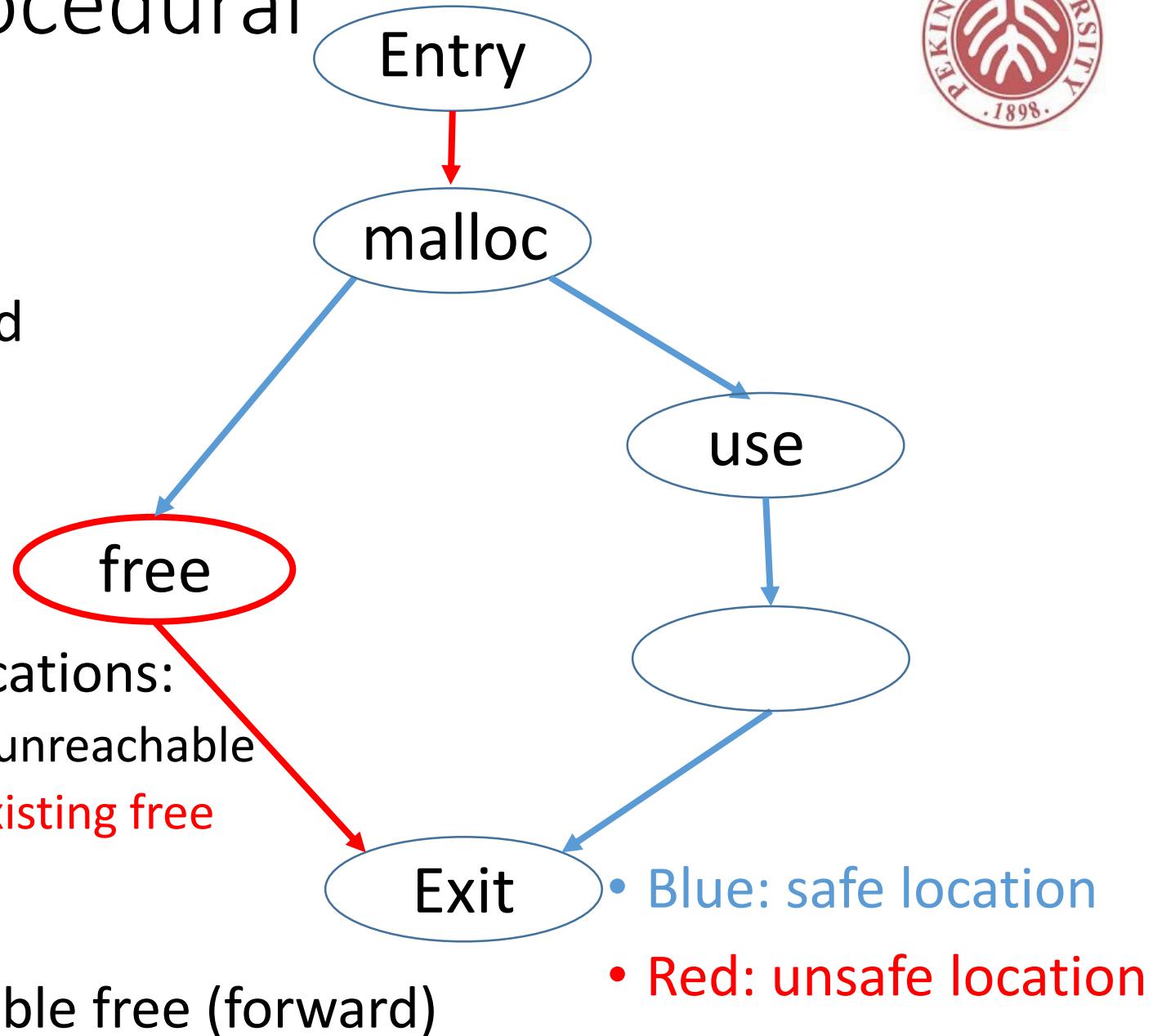
- 1. Forward





Intra-procedural analysis

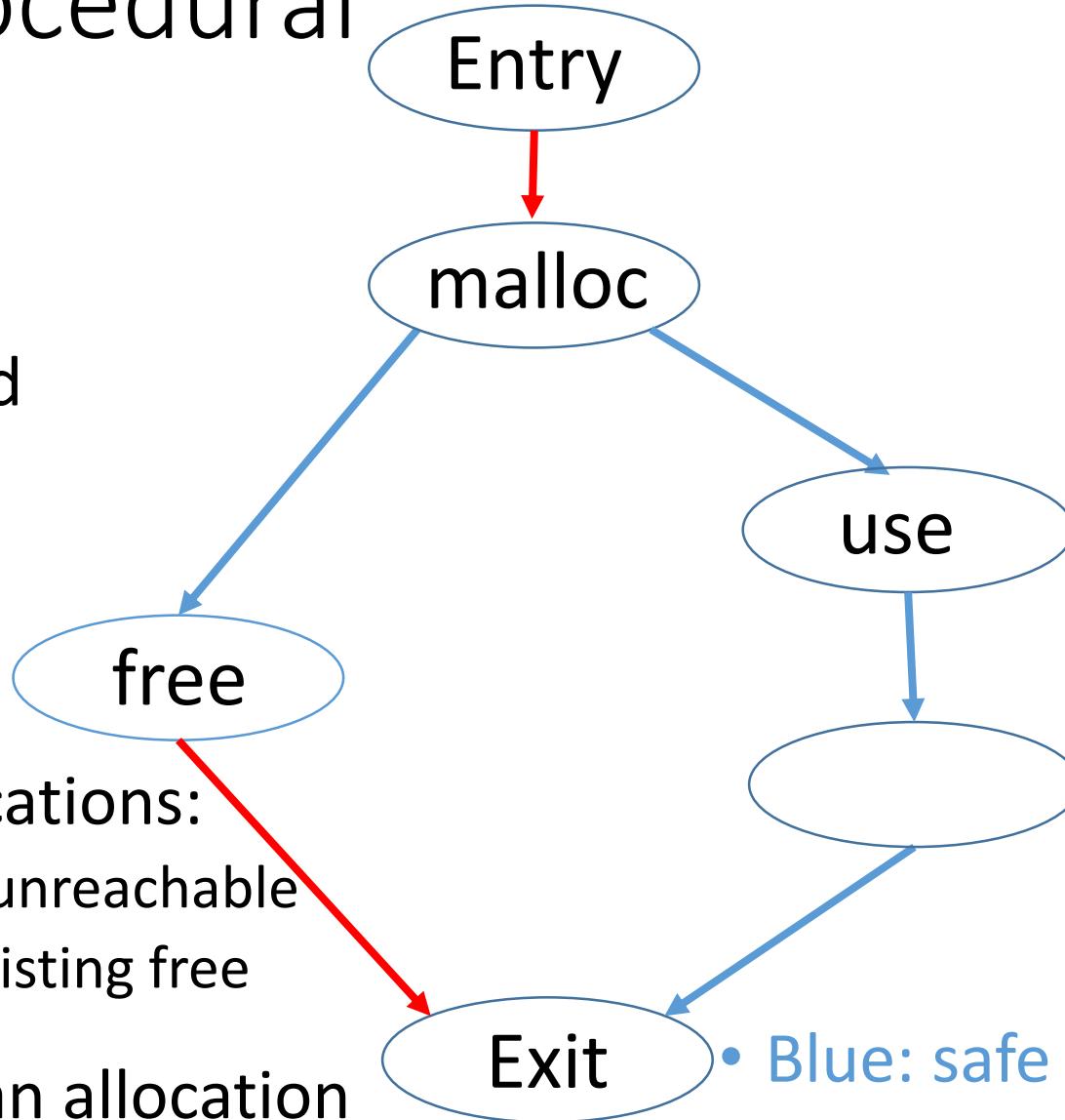
- 1. Forward





Intra-procedural analysis

- 1. Forward



- unsafe locations:

- Malloc unreachable
- After existing free

- Blue: safe location
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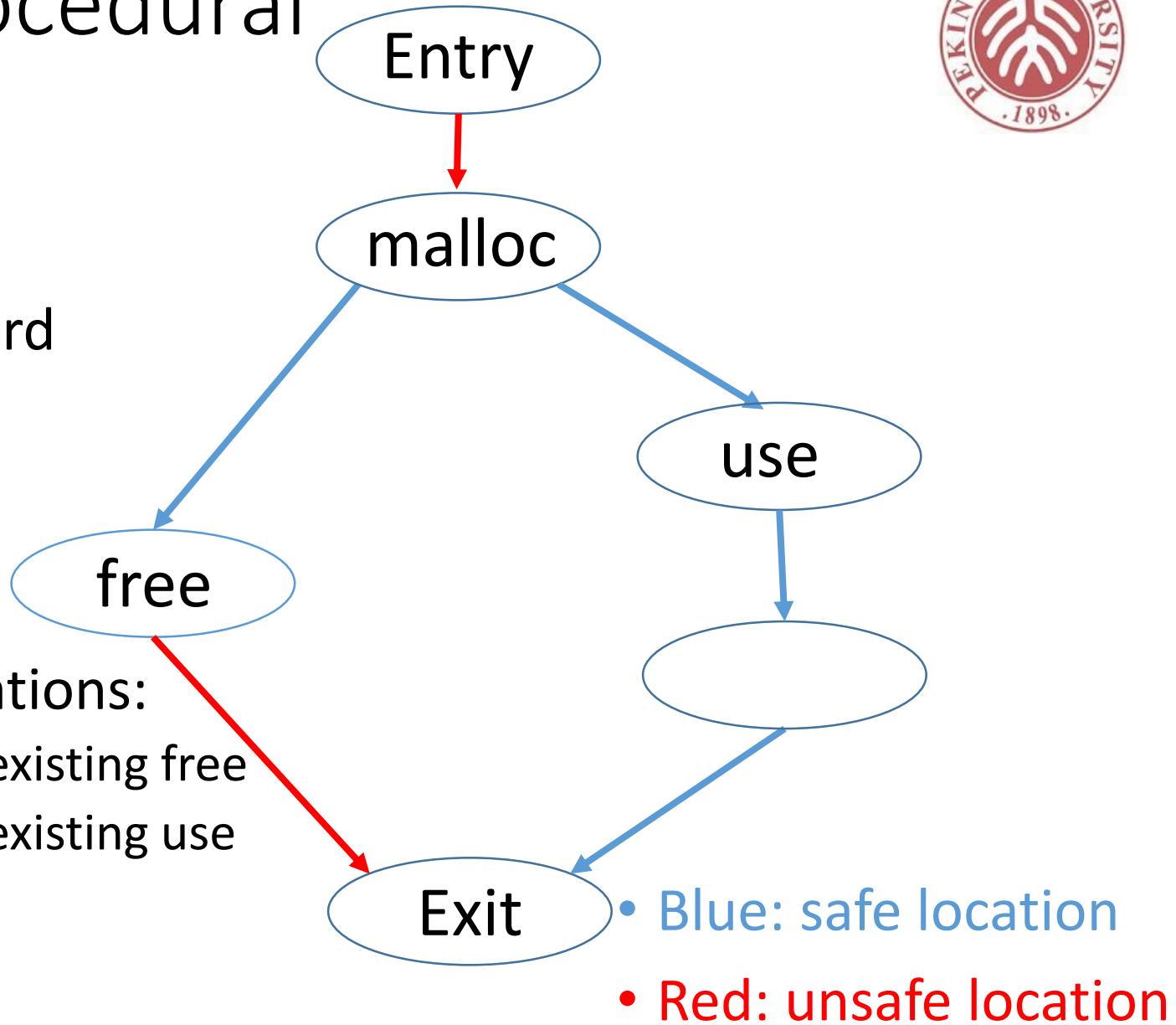
The fix is after an allocation

There is no double free (forward)



Intra-procedural analysis

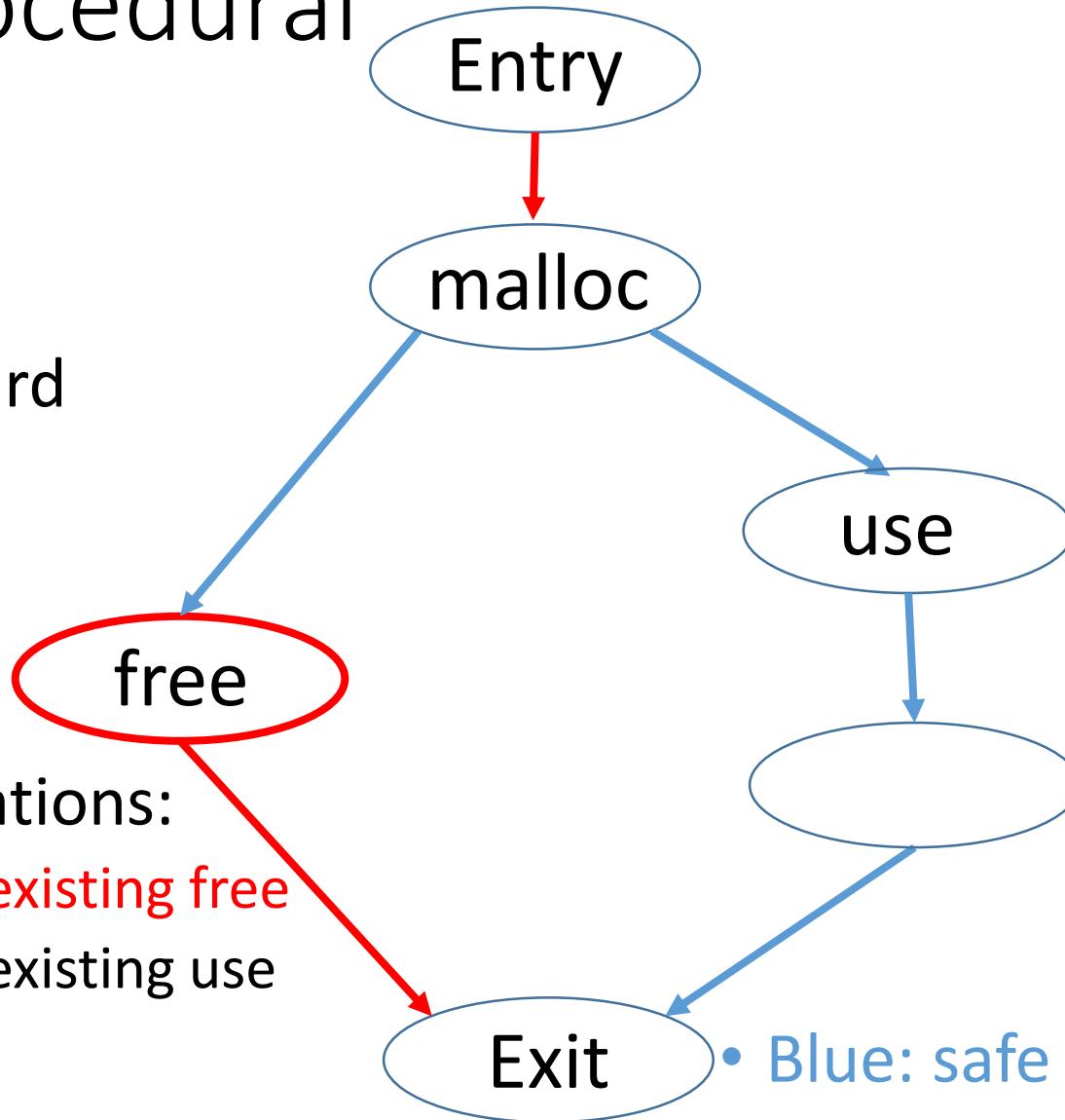
- 2. Backward





Intra-procedural analysis

- 2. Backward



unsafe locations:

- Before existing free
- Before existing use

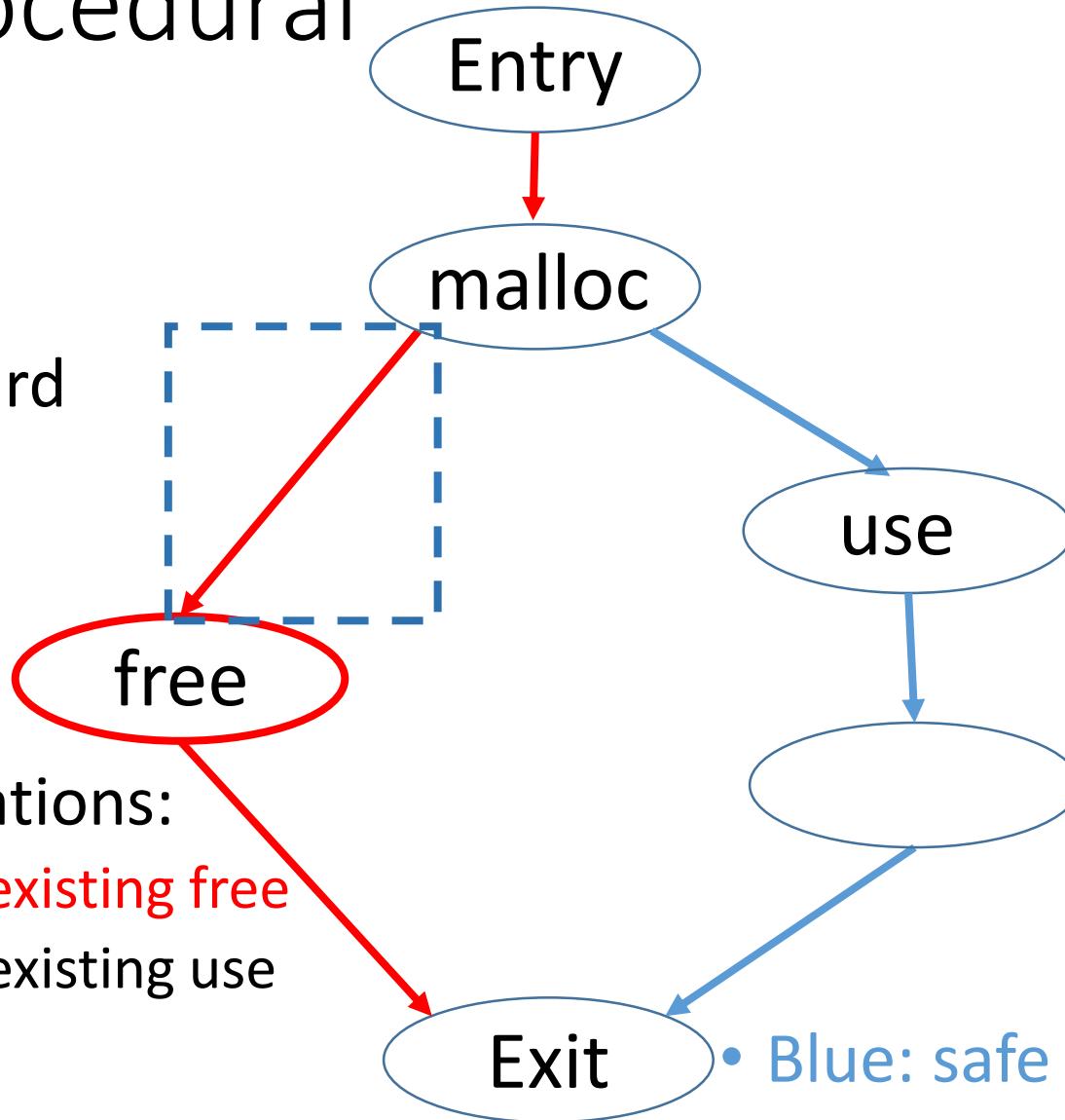
- Blue: safe location
- Red: unsafe location

There is no double free (backward)



Intra-procedural analysis

- 2. Backward



unsafe locations:

- Before existing free
- Before existing use

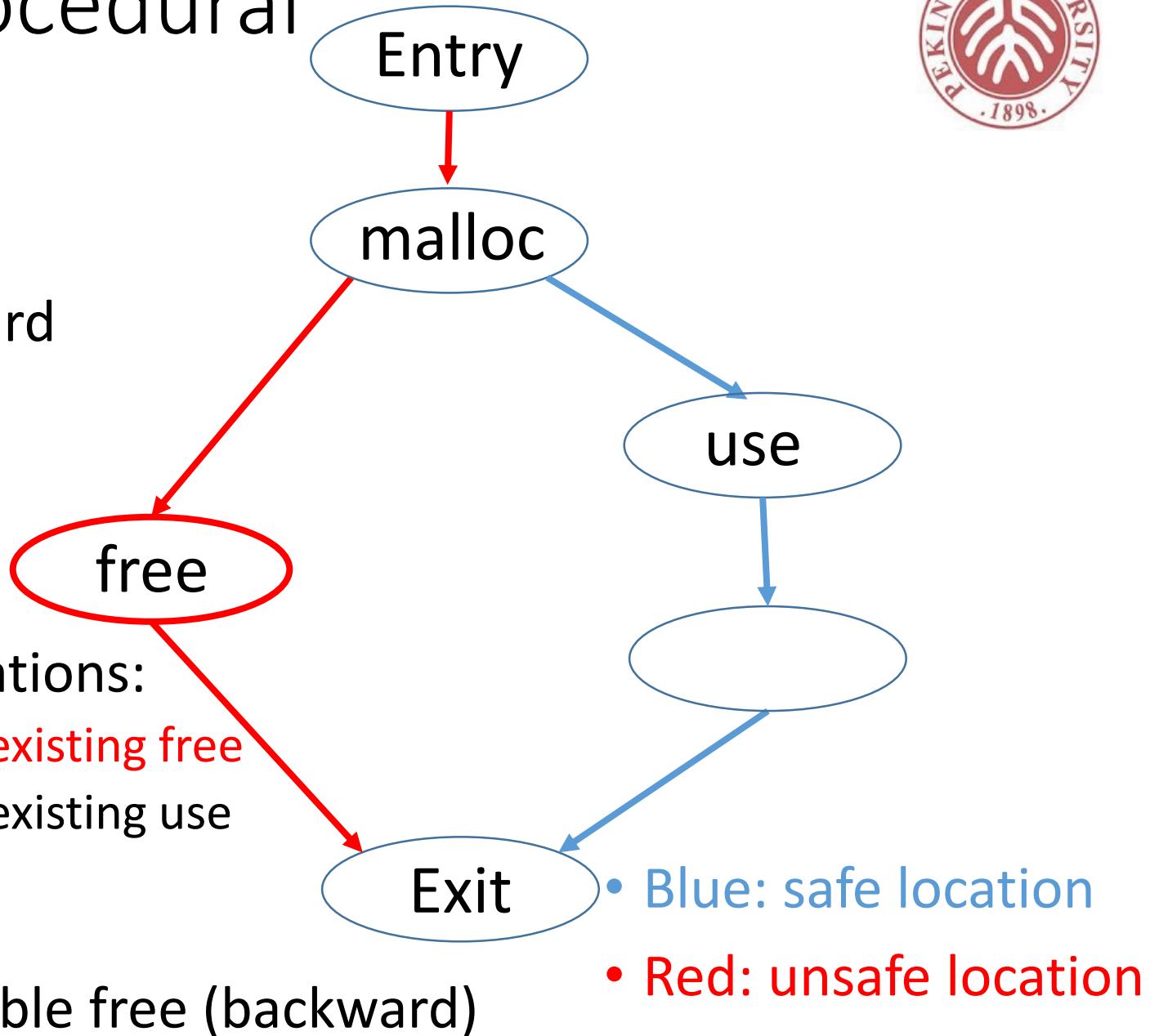
- Blue: safe location
- Red: unsafe location

There is no double free (backward)



Intra-procedural analysis

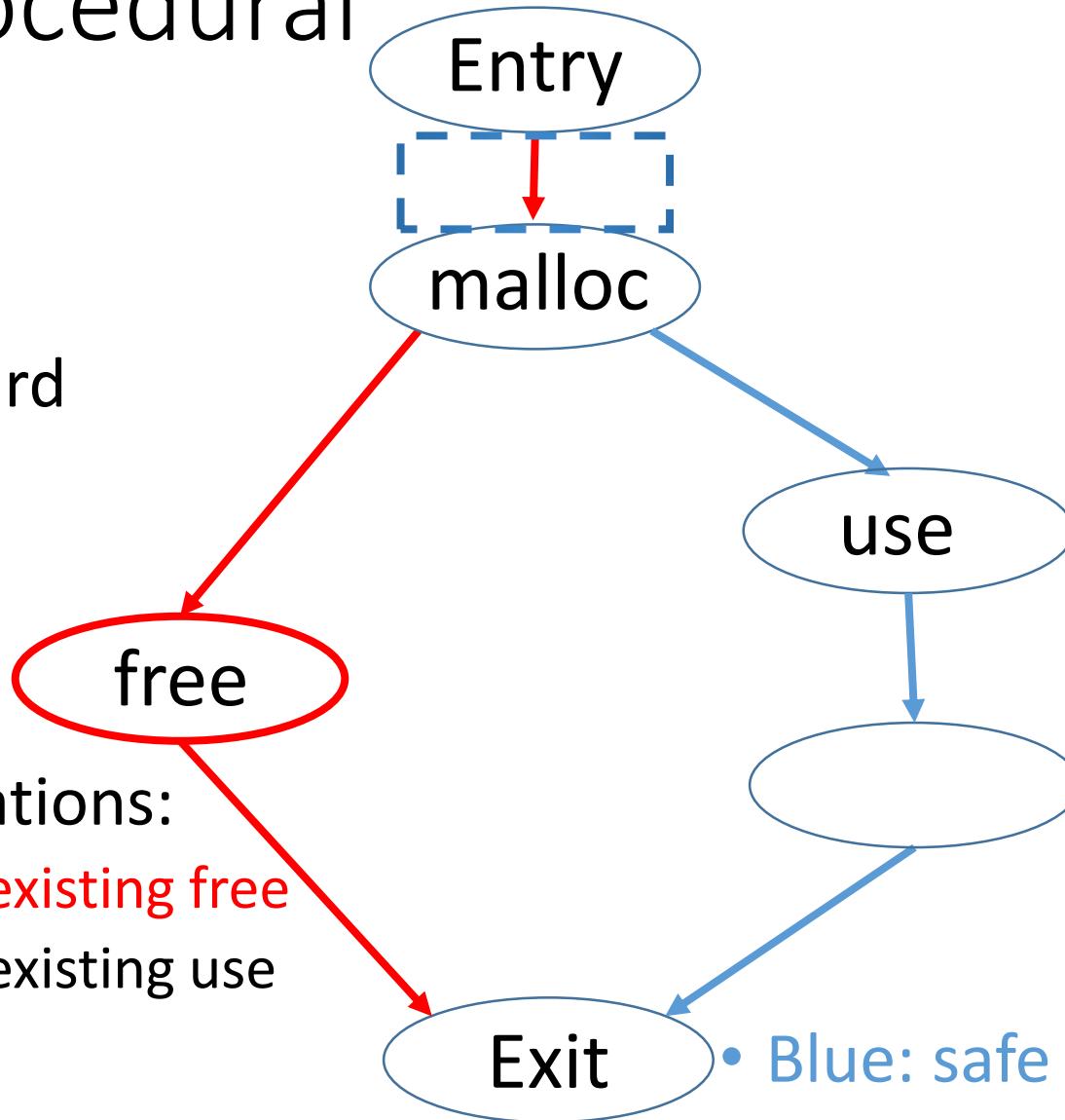
- 2. Backward





Intra-procedural analysis

- 2. Backward



unsafe locations:

- Before existing free
- Before existing use

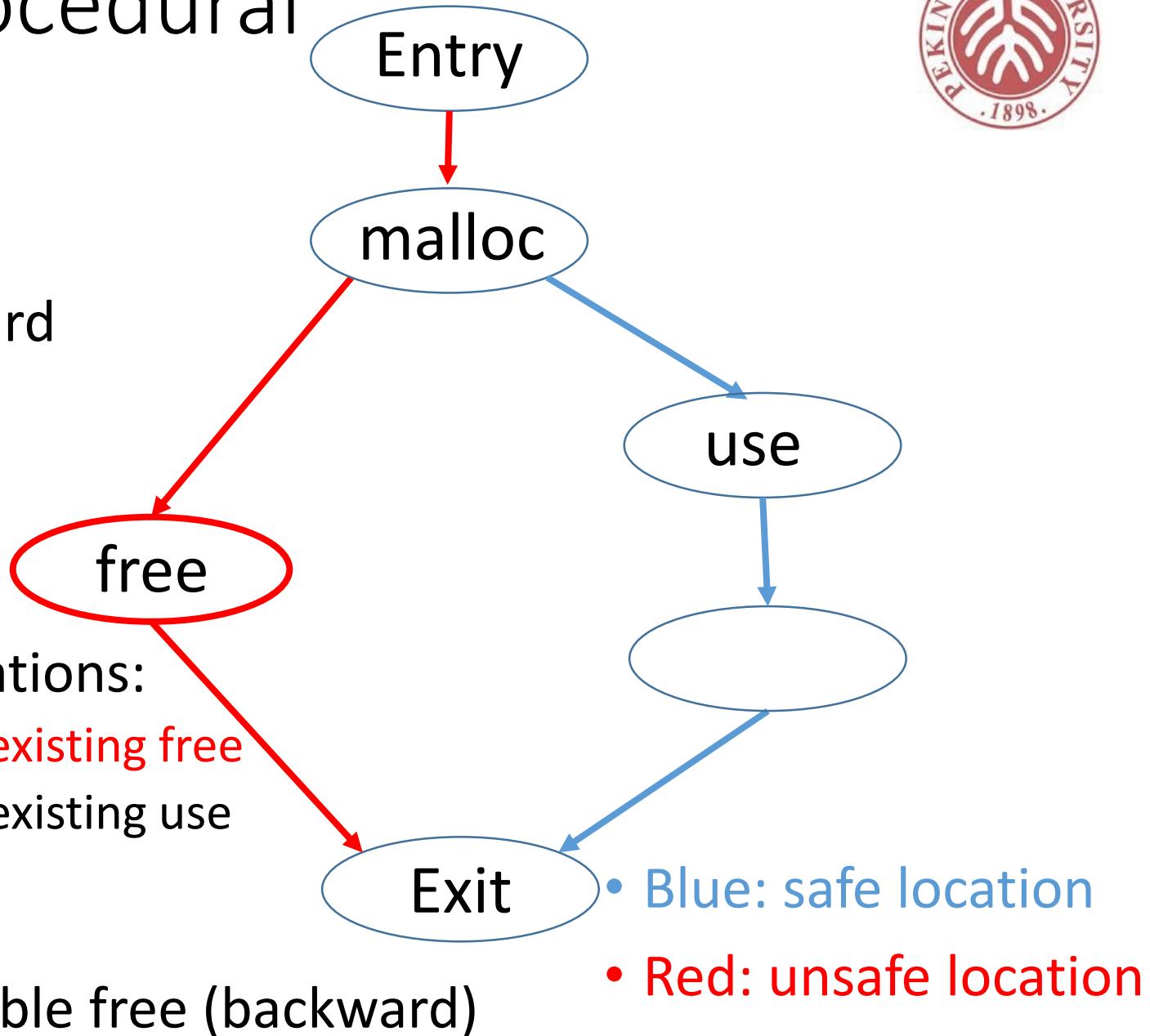
- Blue: safe location
- Red: unsafe location

There is no double free (backward)



Intra-procedural analysis

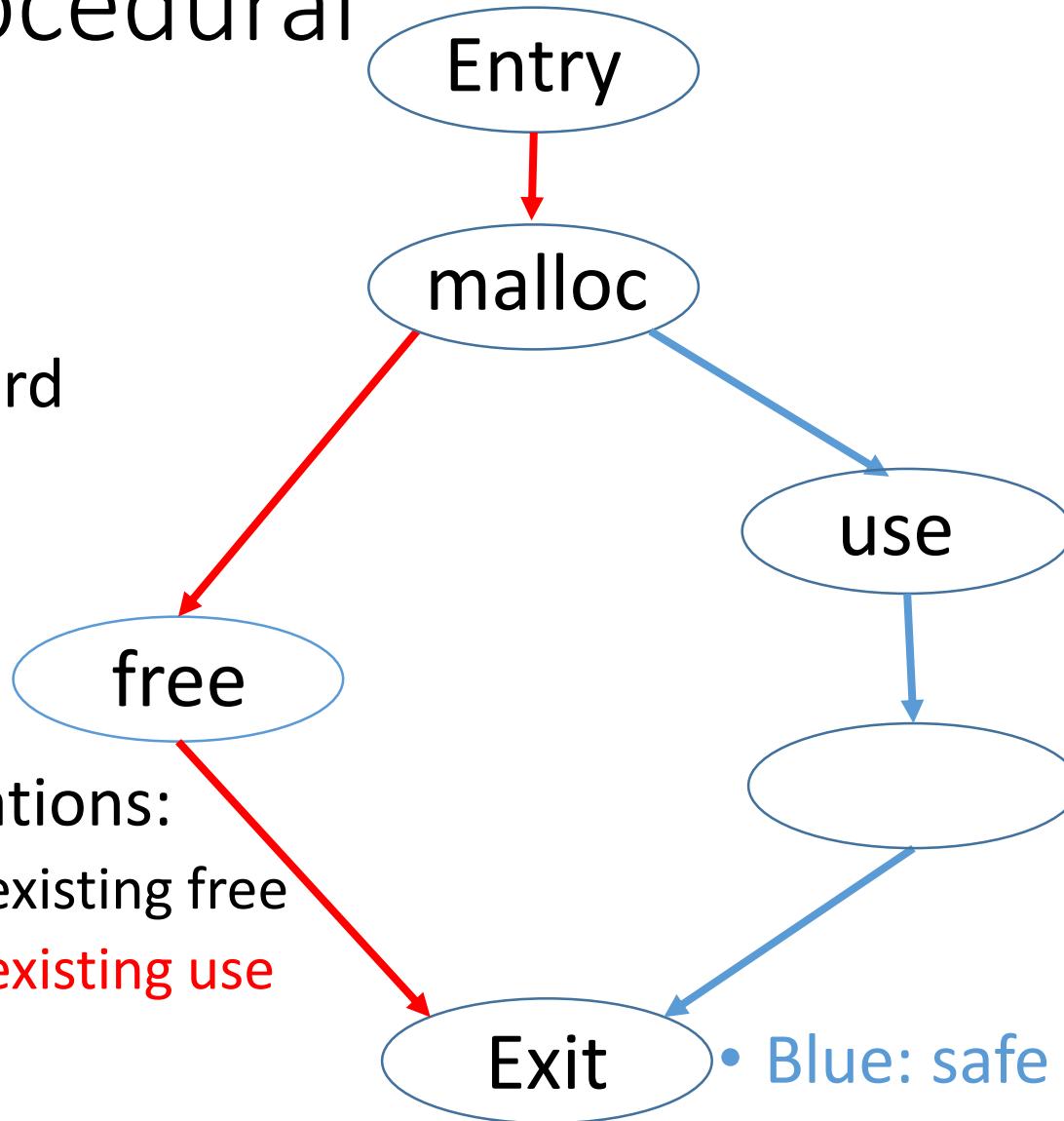
- 2. Backward





Intra-procedural analysis

- 2. Backward



unsafe locations:

- Before existing free
- Before existing use

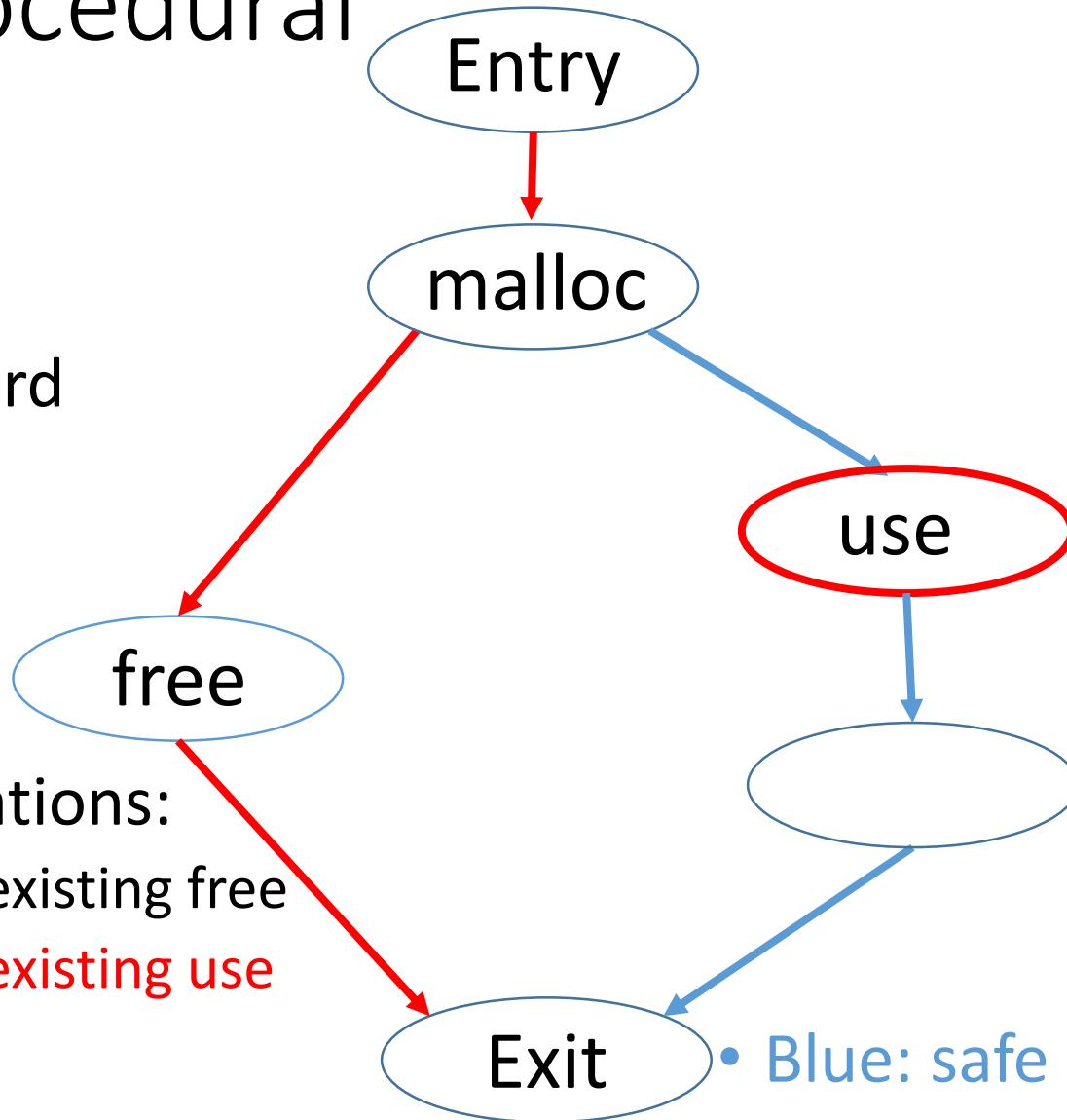
- Blue: safe location
- Red: unsafe location

There is no use after free



Intra-procedural analysis

- 2. Backward



unsafe locations:

- Before existing free
- Before existing use

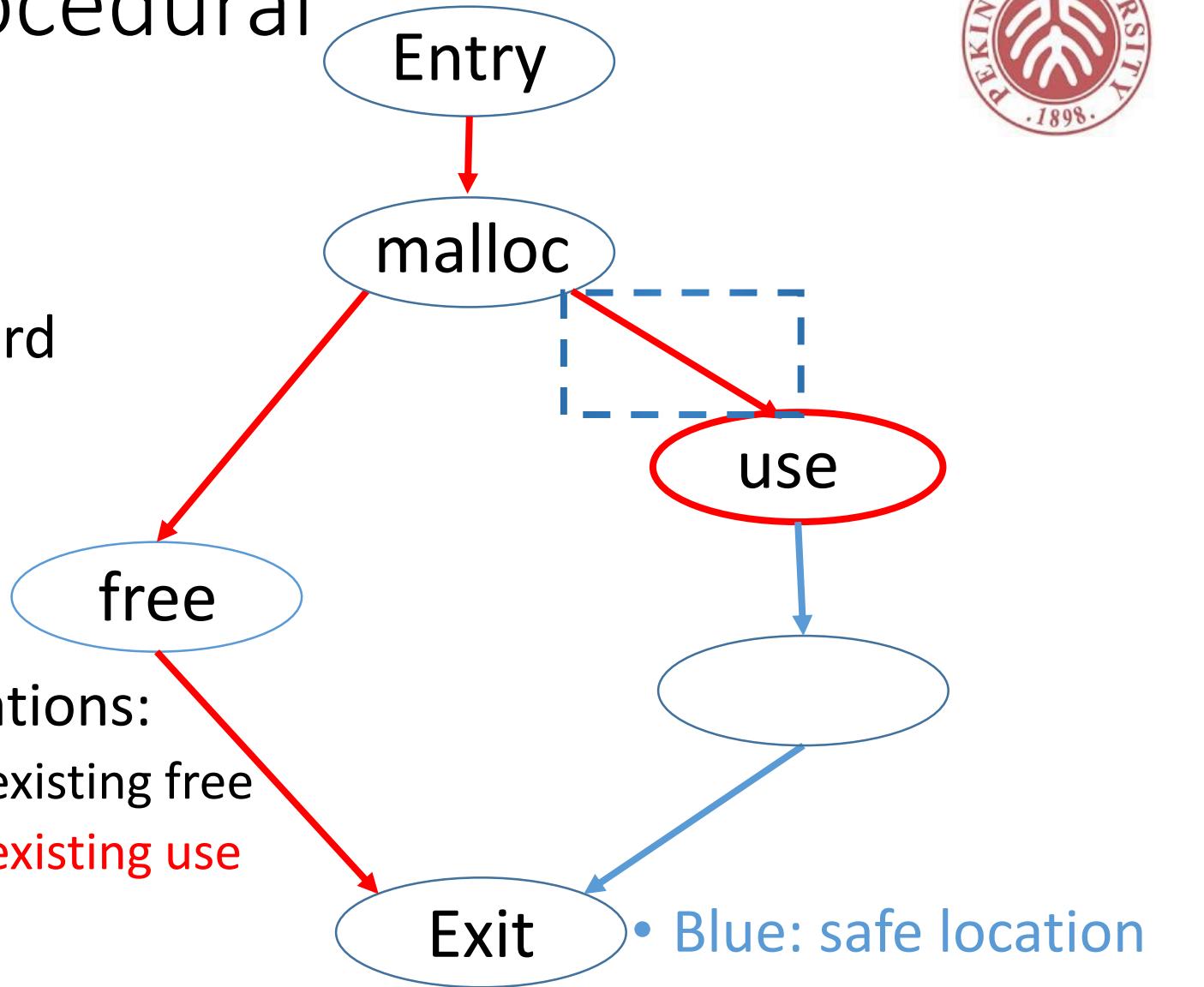
- Blue: safe location
- Red: unsafe location

There is no use after free



Intra-procedural analysis

- 2. Backward

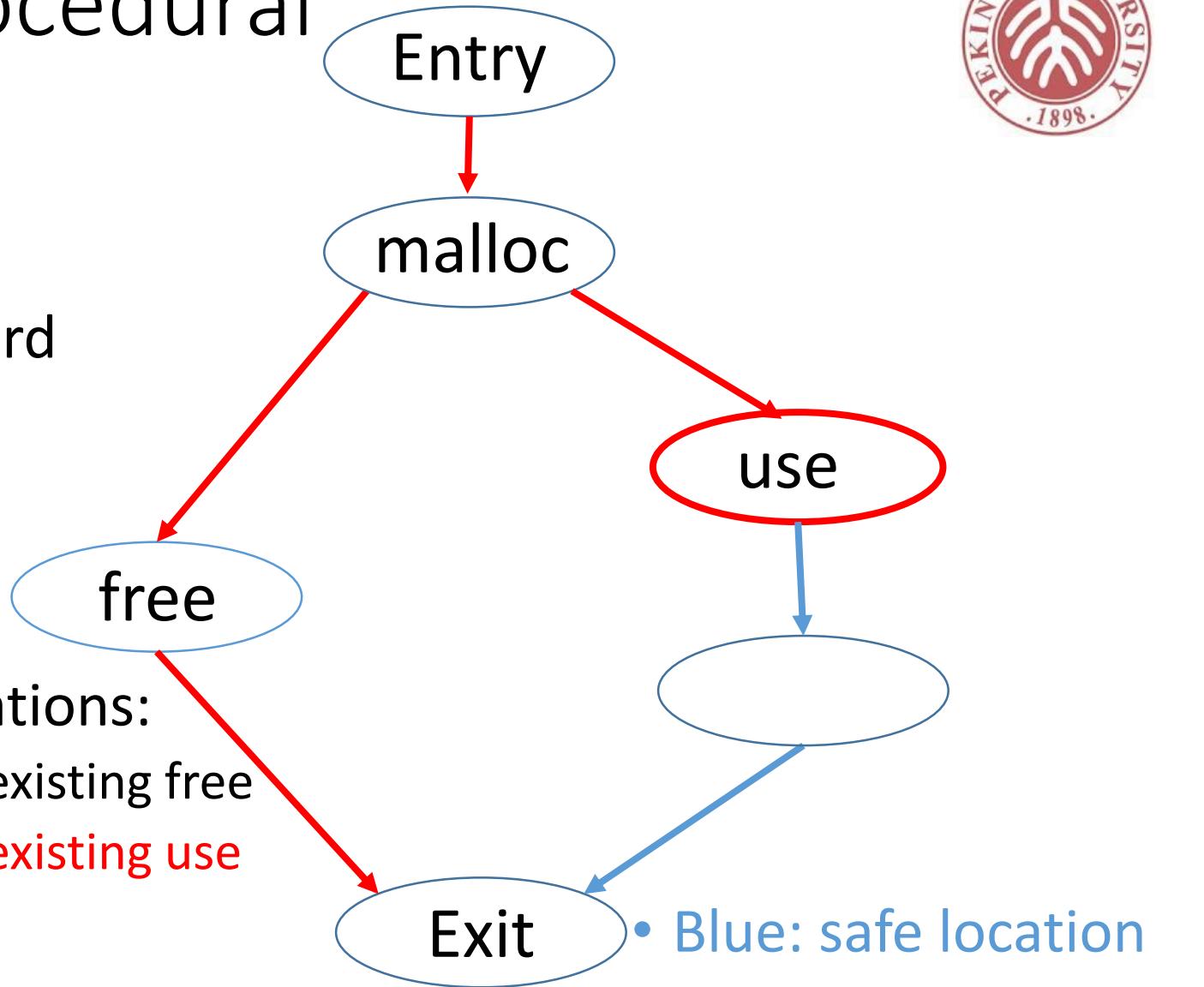


There is no use after free



Intra-procedural analysis

- 2. Backward



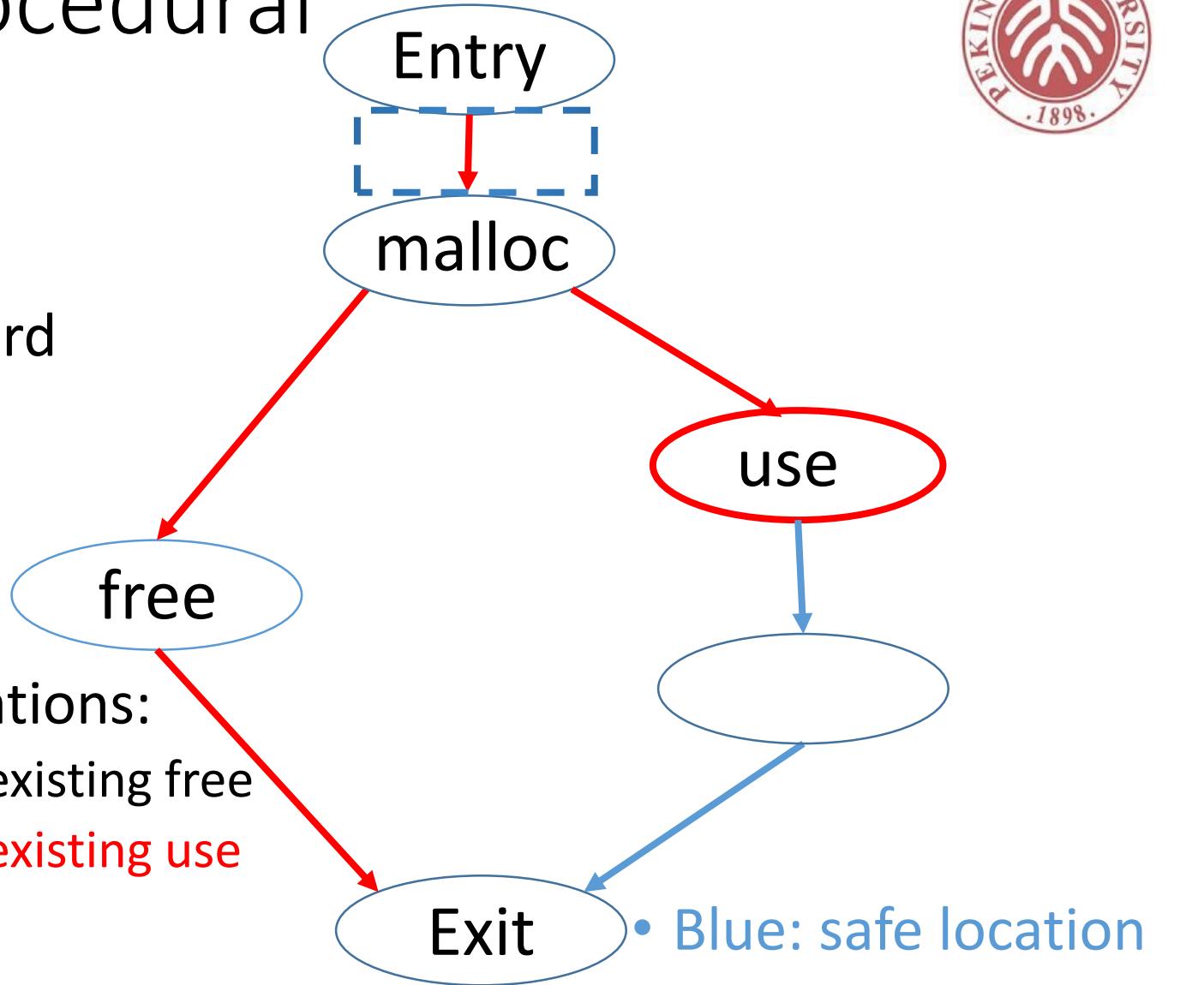
- Blue: safe location
- Red: unsafe location

There is no use after free



Intra-procedural analysis

- 2. Backward

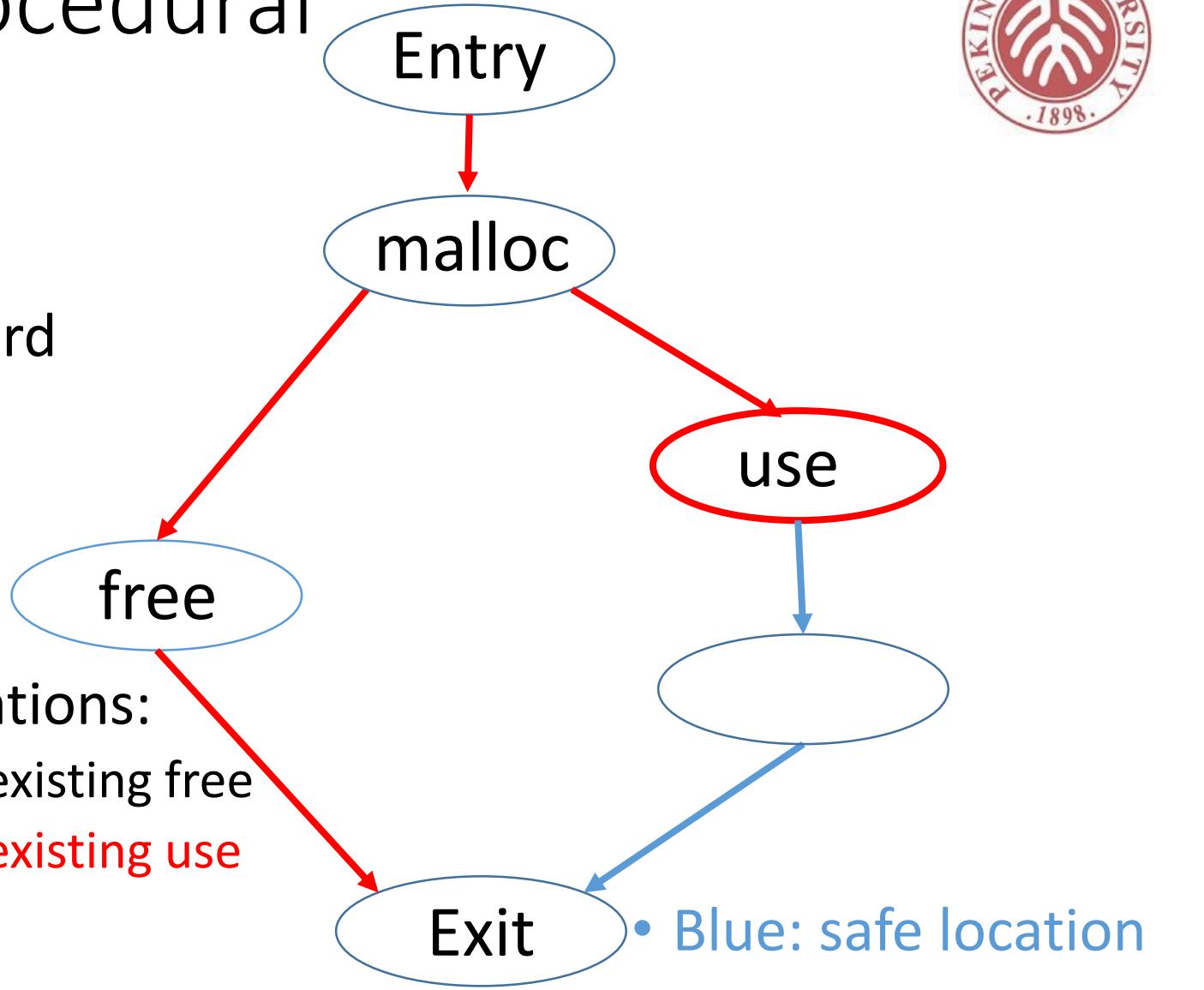


There is no use after free



Intra-procedural analysis

- 2. Backward



unsafe locations:

- Before existing free
- Before existing use

Exit

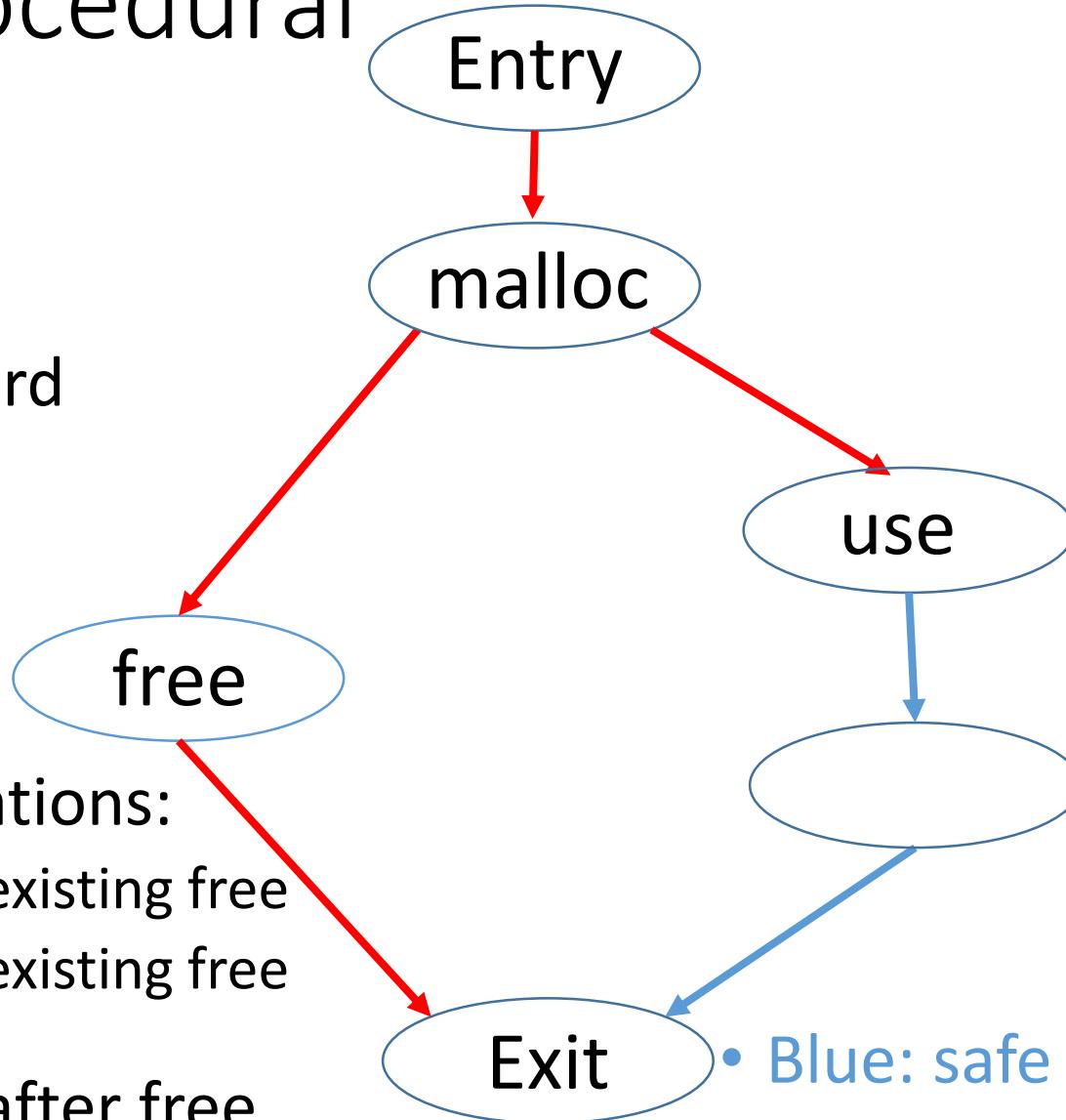
- Blue: safe location
- Red: unsafe location

There is no use after free



Intra-procedural analysis

- 2. Backward



unsafe locations:

- Before existing free
- Before existing free

There is no use after free

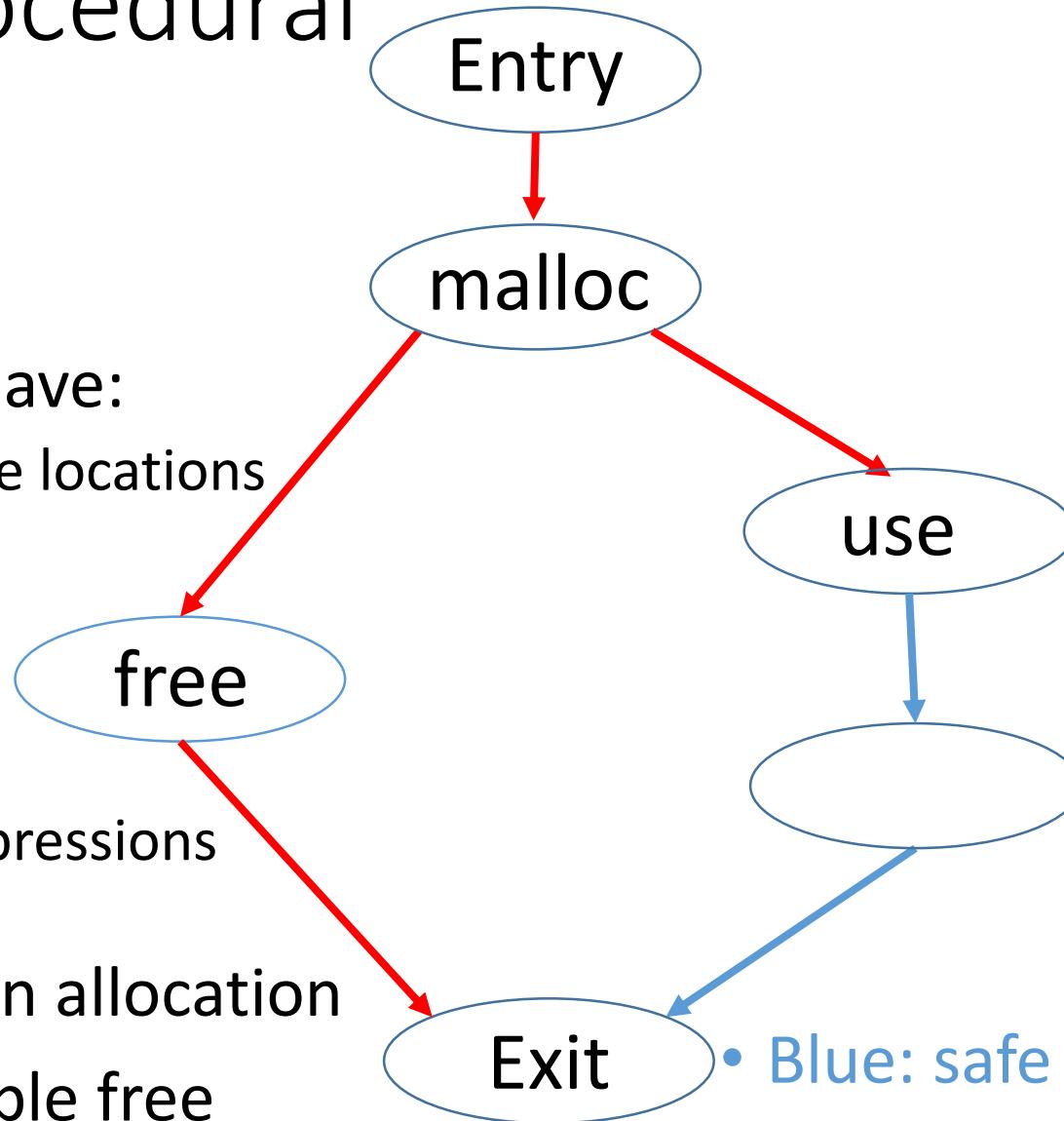
There is no double free (backward)

- Blue: safe location
- Red: unsafe location



Intra-procedural analysis

- Now we have:
 - Safe free locations
- Next:
 - Safe expressions



The fix is after an allocation

There is no double free

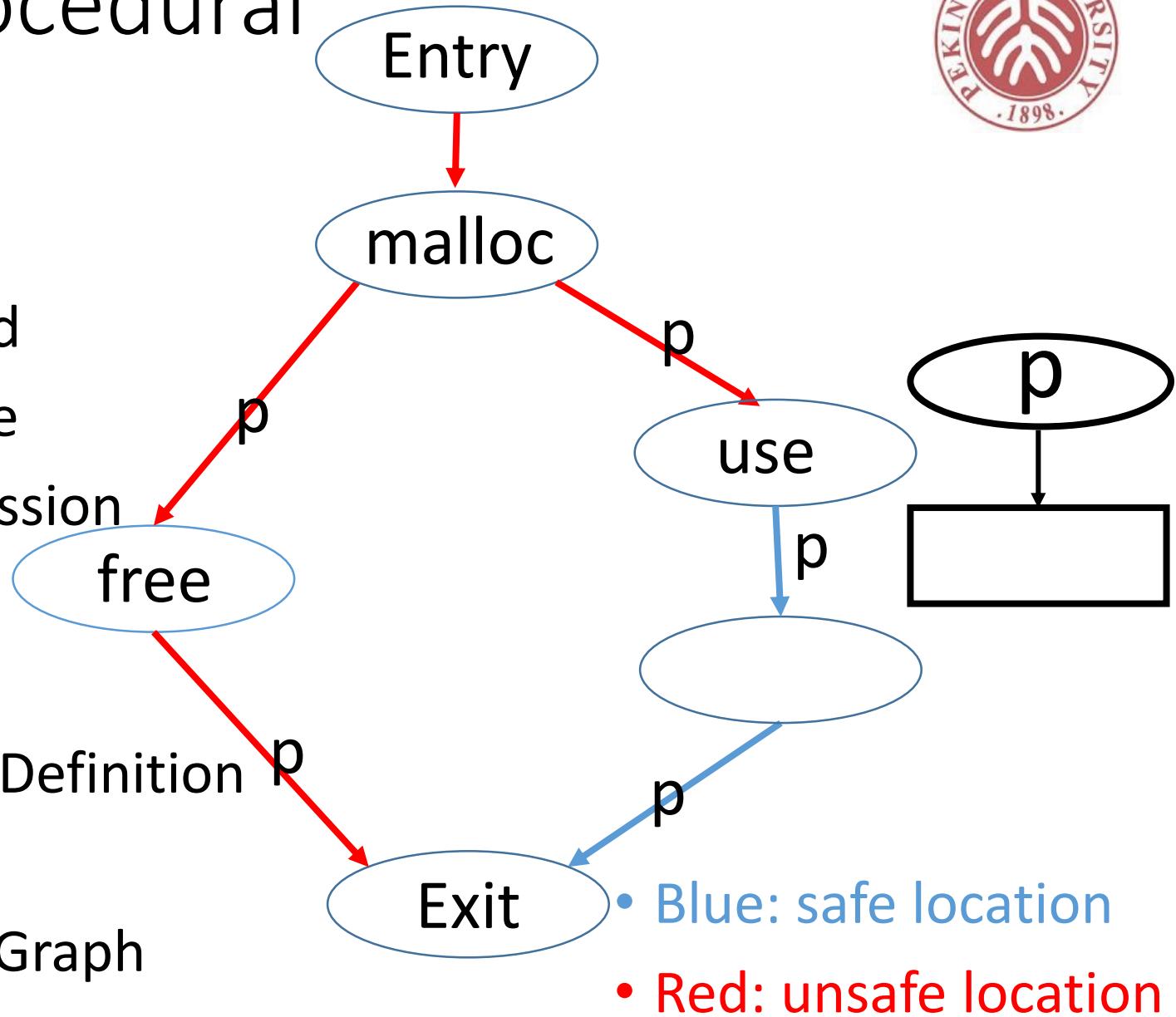
There is no use after free

- Blue: safe location
- Red: unsafe location

Intra-procedural analysis



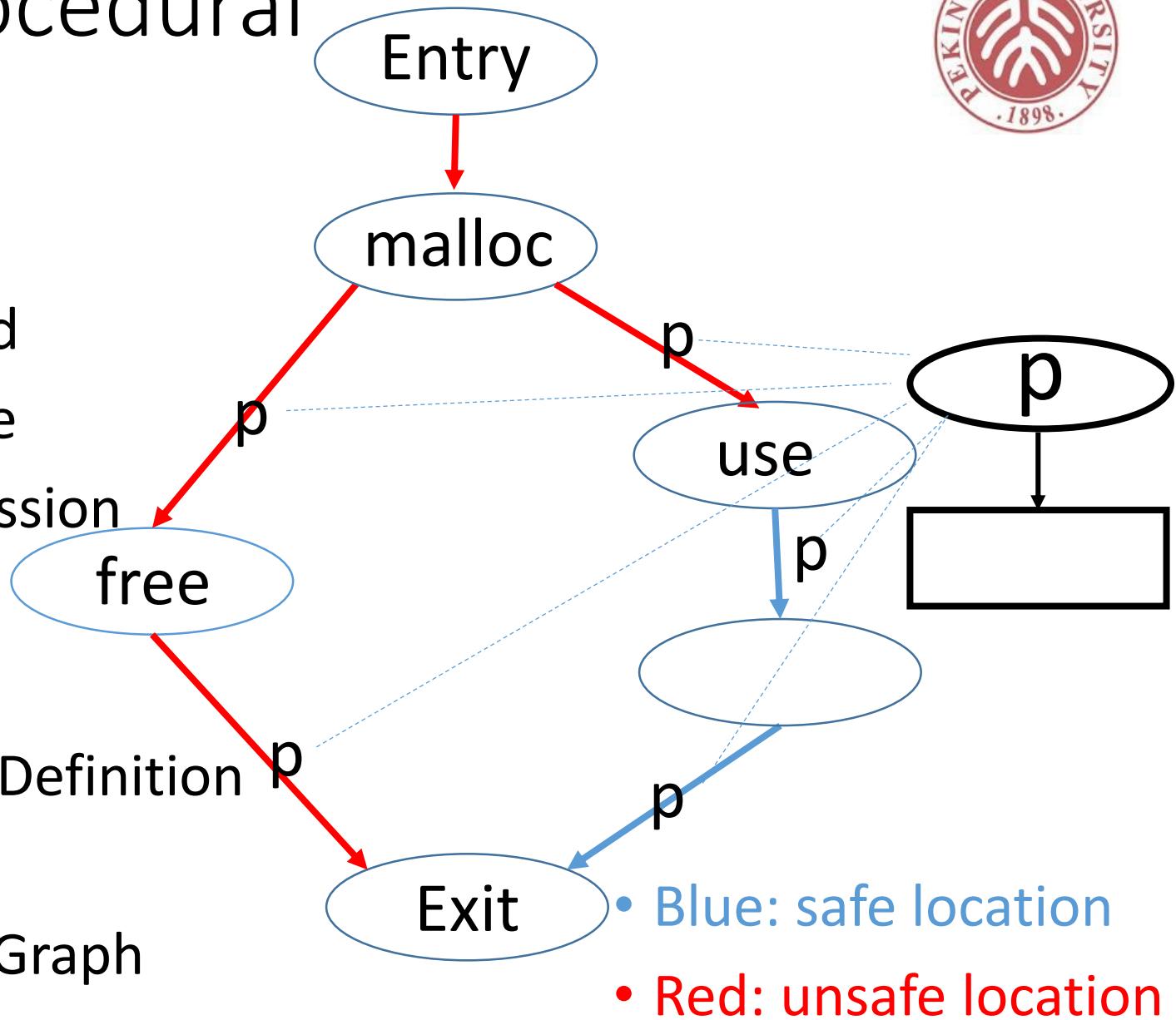
- 3. Forward
- Determine safe expression



Intra-procedural analysis



- 3. Forward
- Determine safe expression
- Reaching-Definition Analysis
- Points-to Graph





Intra-procedural analysis

- Now we have:

- Safe free locations p
- Safe expressions

- Next:

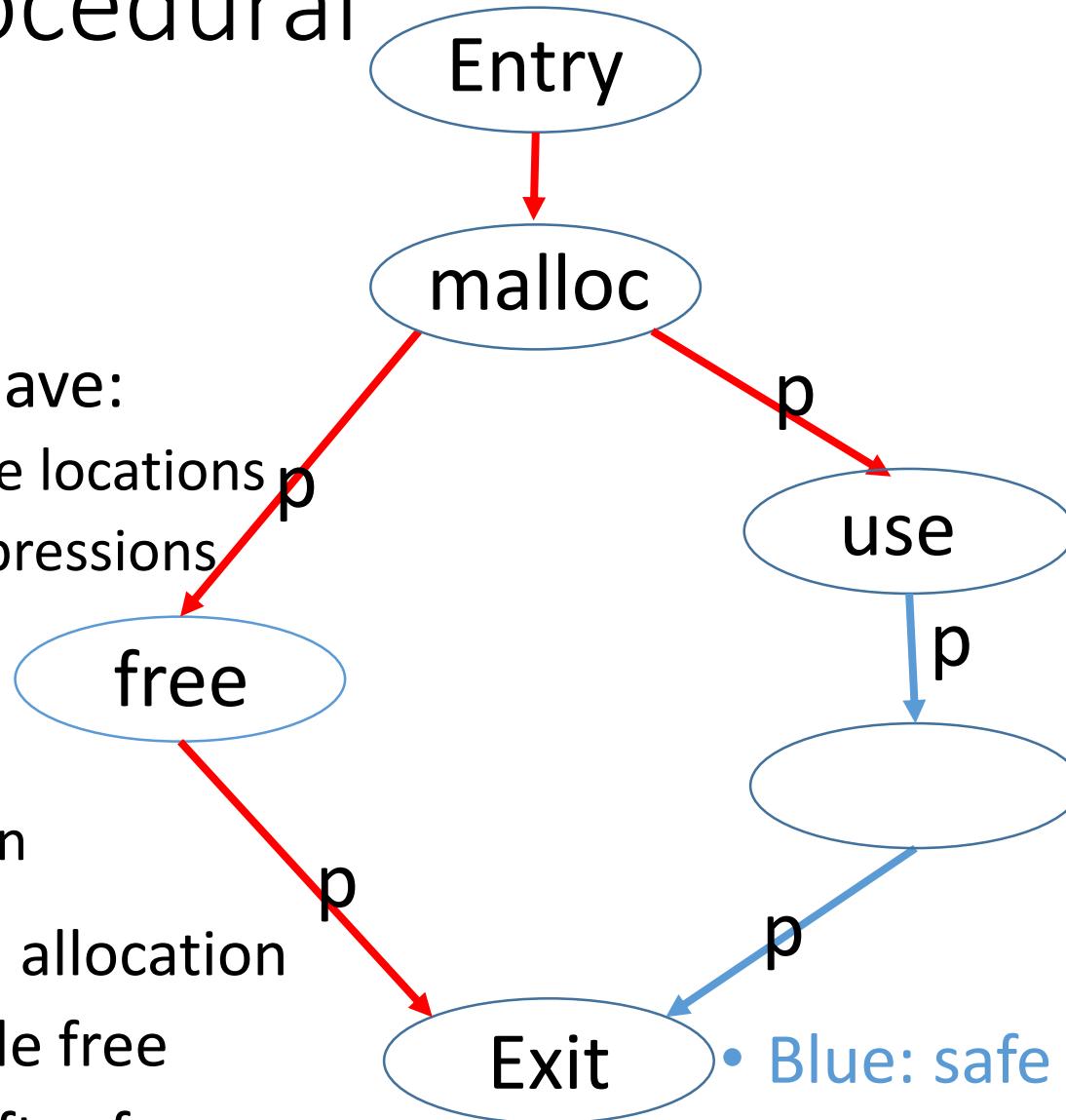
- Insertion

The fix is after an allocation

There is no double free

There is no use after free

There is an expression

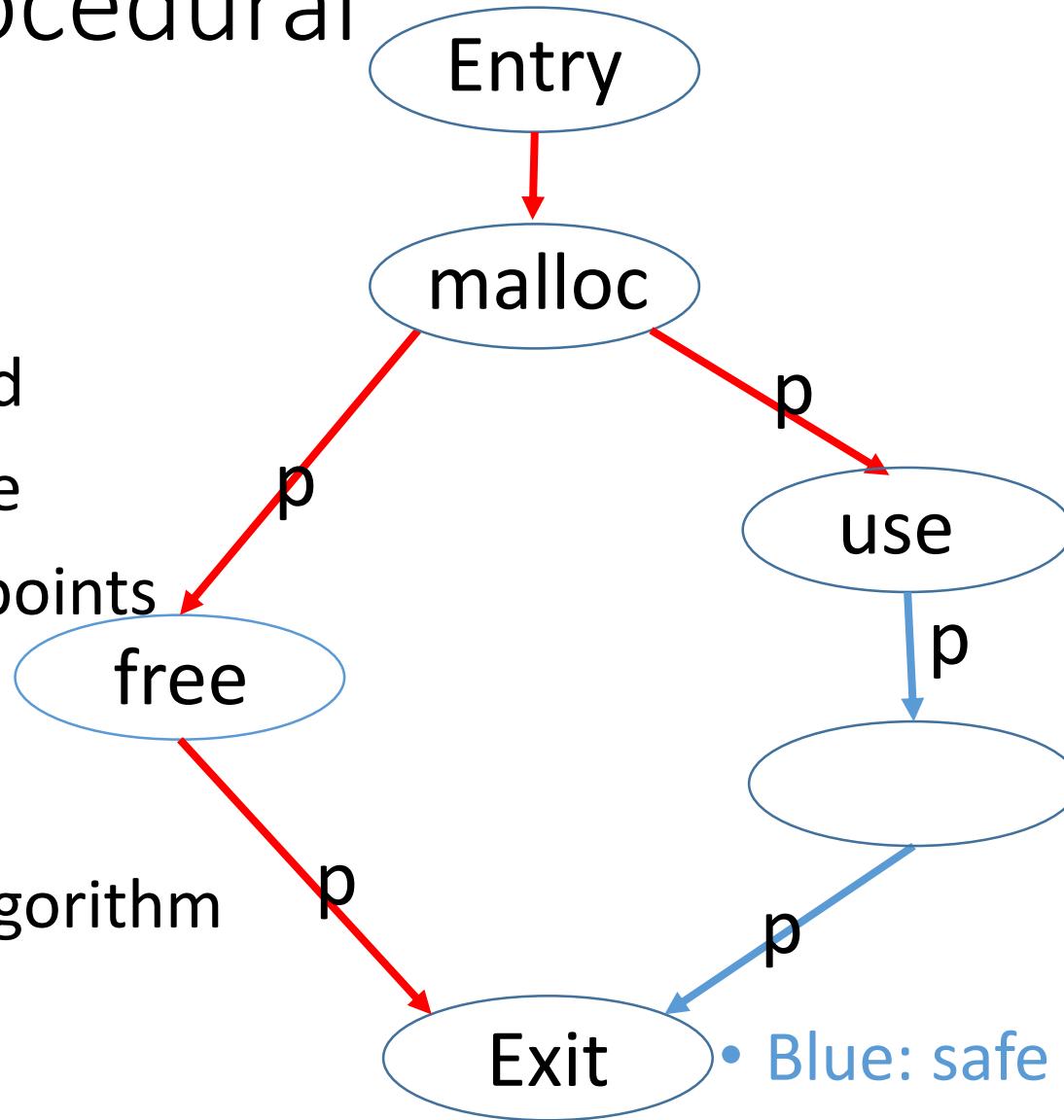


- Blue: safe location
- Red: unsafe location



Intra-procedural analysis

- 4. Forward
- Determine early free points
- Greedy algorithm

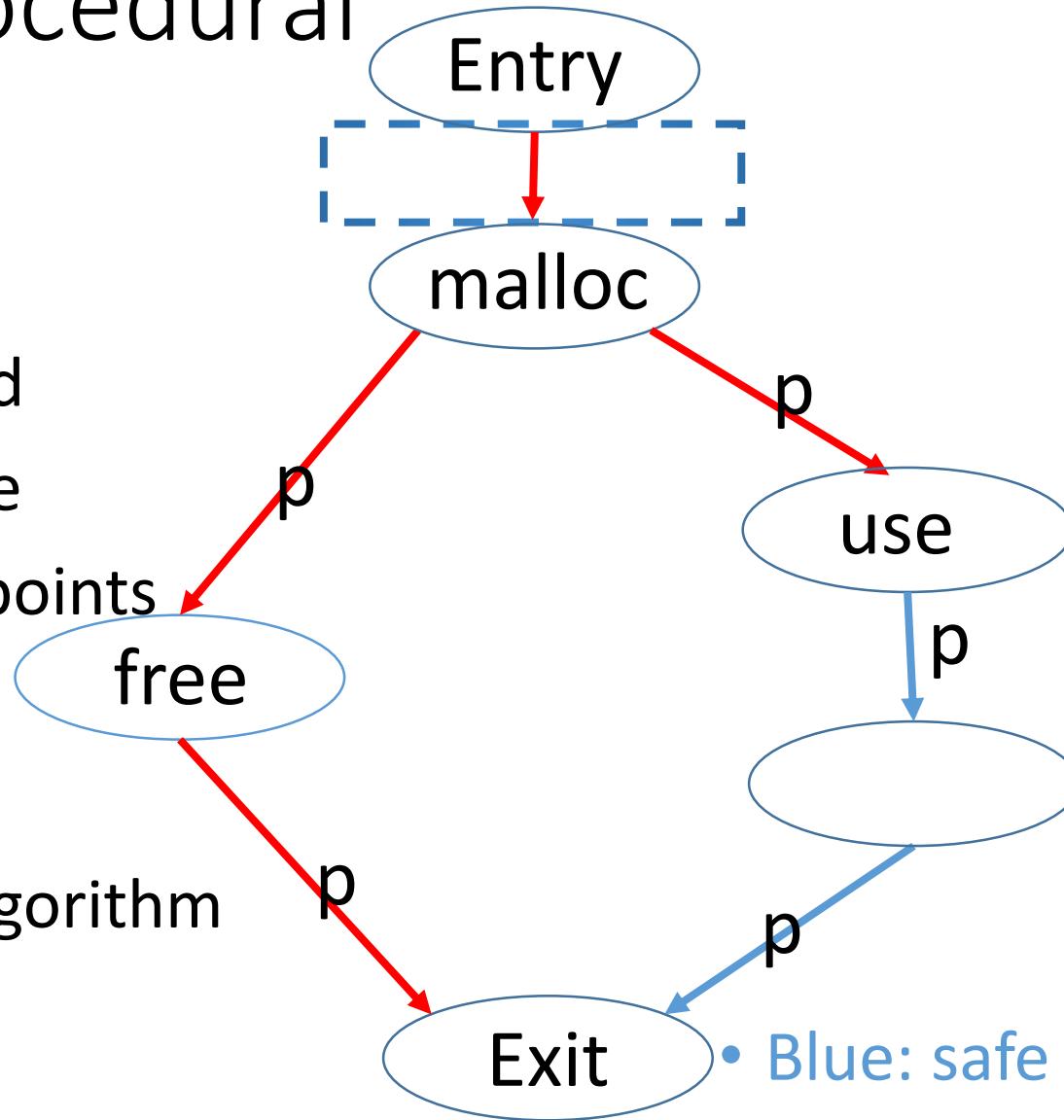


- Blue: safe location
- Red: unsafe location



Intra-procedural analysis

- 4. Forward
- Determine early free points
- Greedy algorithm

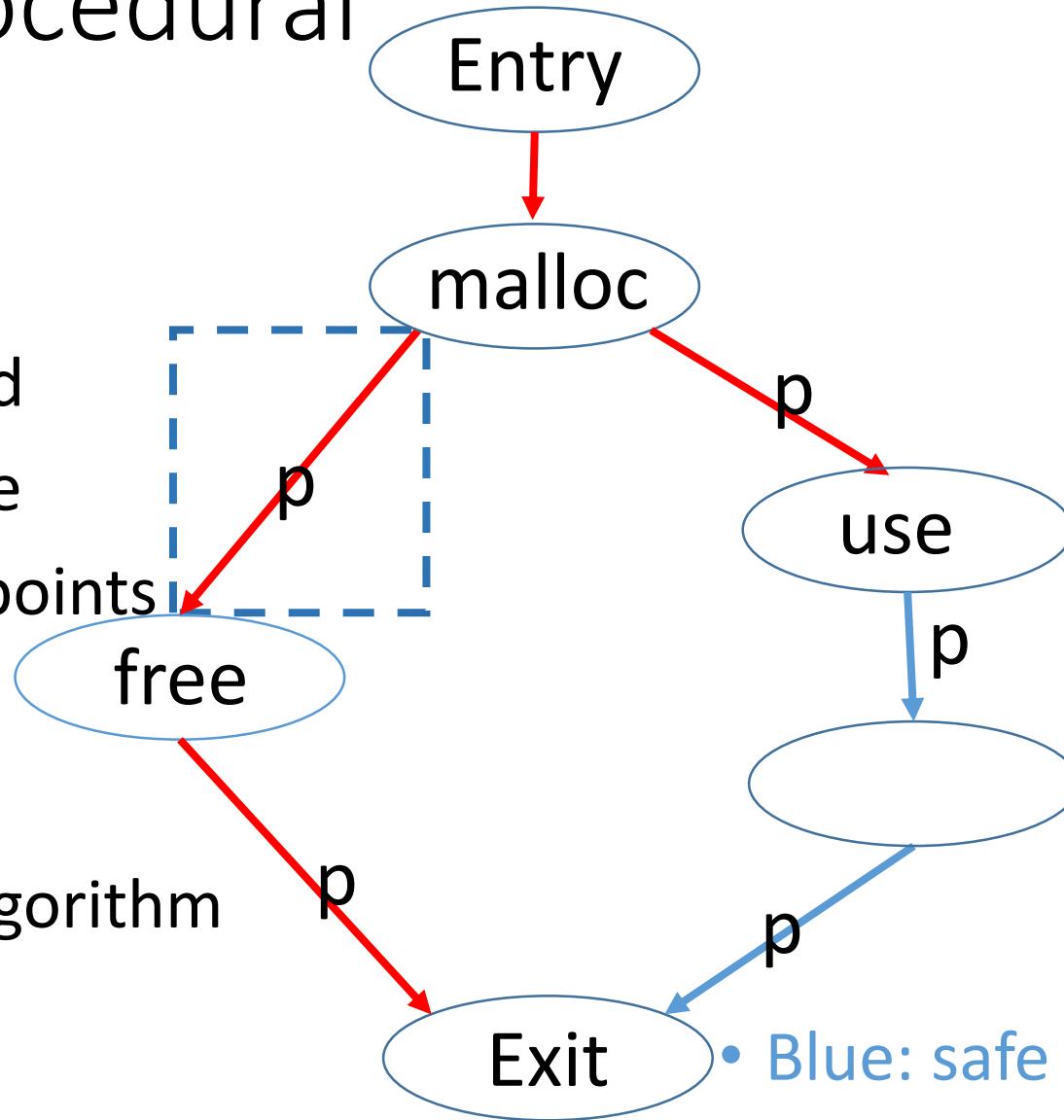


- Blue: safe location
- Red: unsafe location



Intra-procedural analysis

- 4. Forward
- Determine early free points
- Greedy algorithm



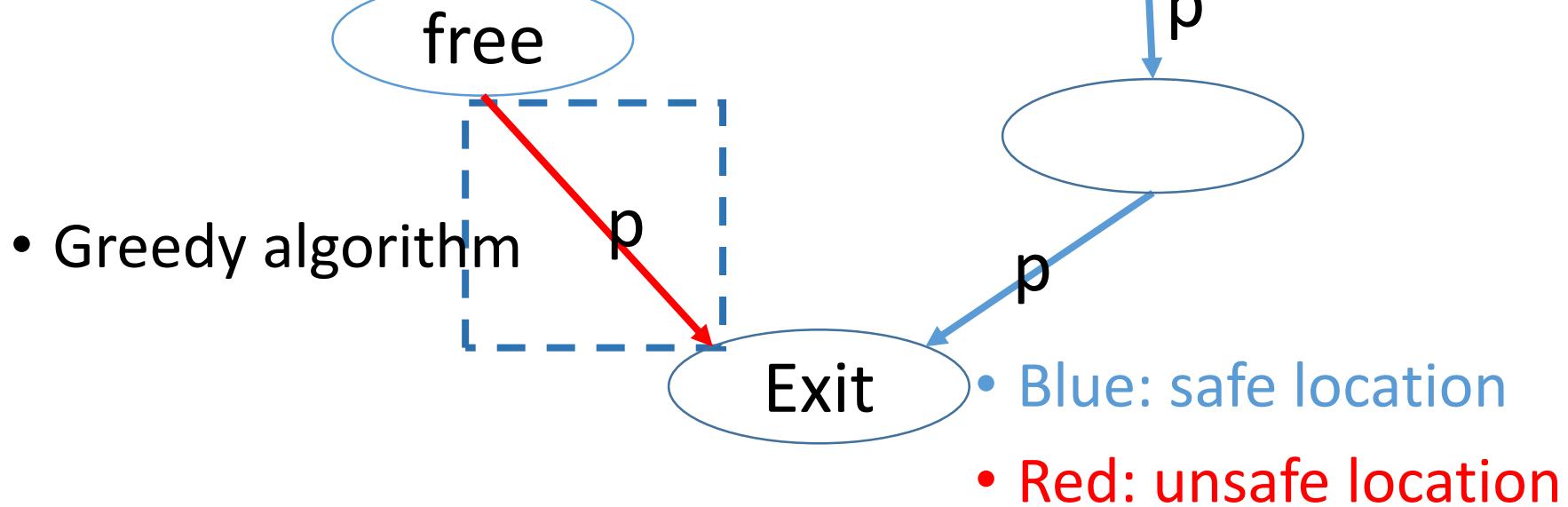
- Blue: safe location
- Red: unsafe location



Intra-procedural analysis

- 4. Forward
- Determine

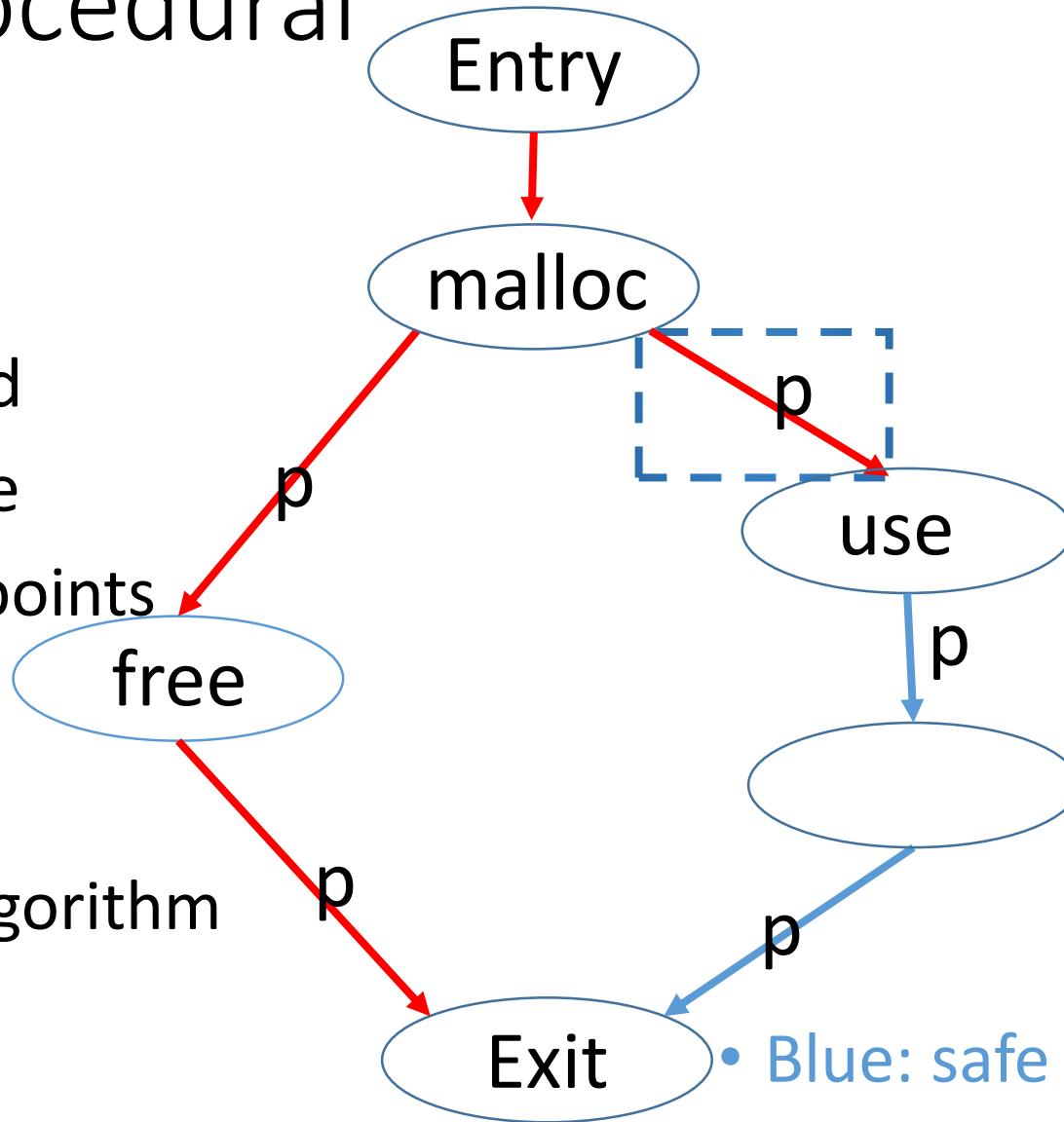
early free points





Intra-procedural analysis

- 4. Forward
- Determine early free points
- Greedy algorithm

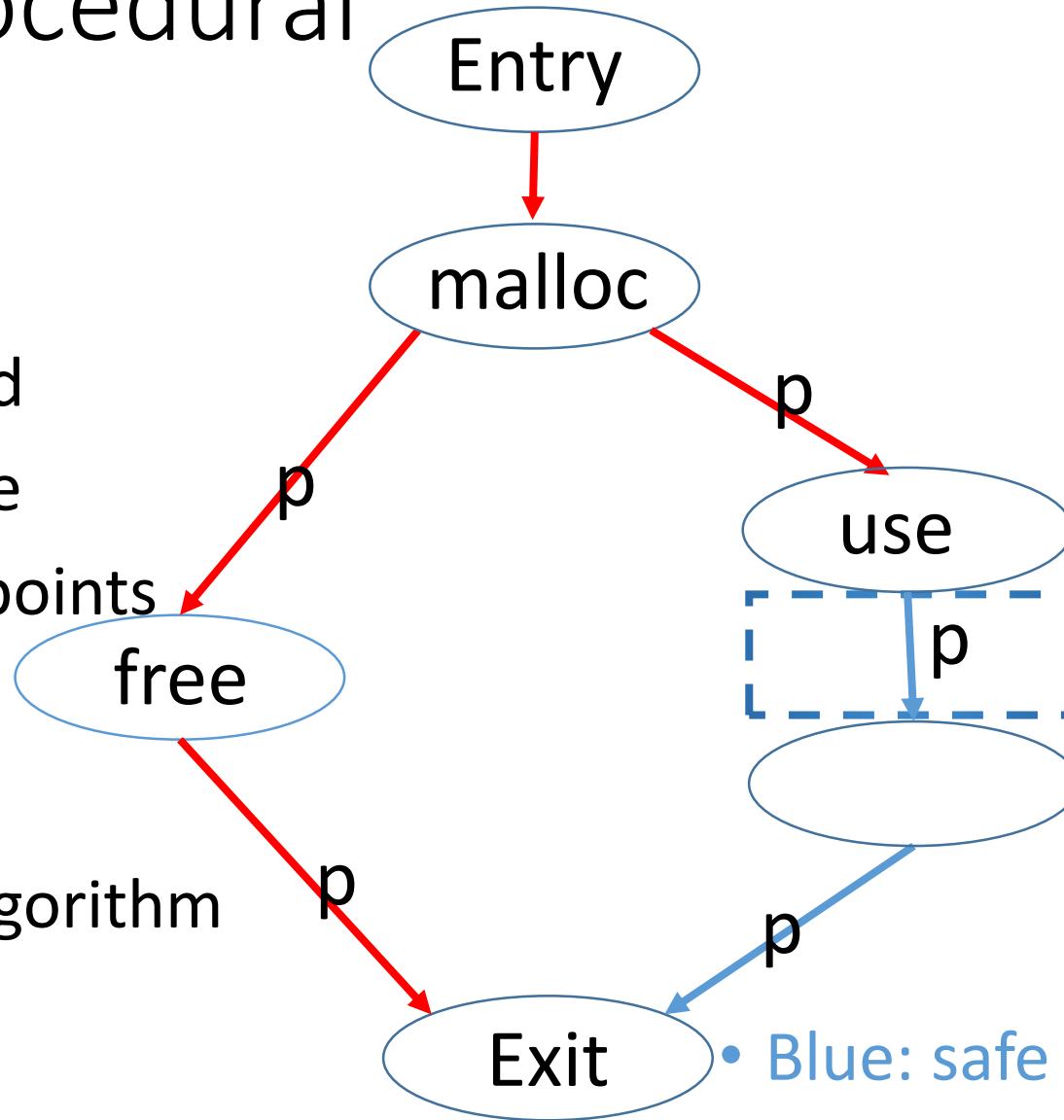


- Blue: safe location
- Red: unsafe location



Intra-procedural analysis

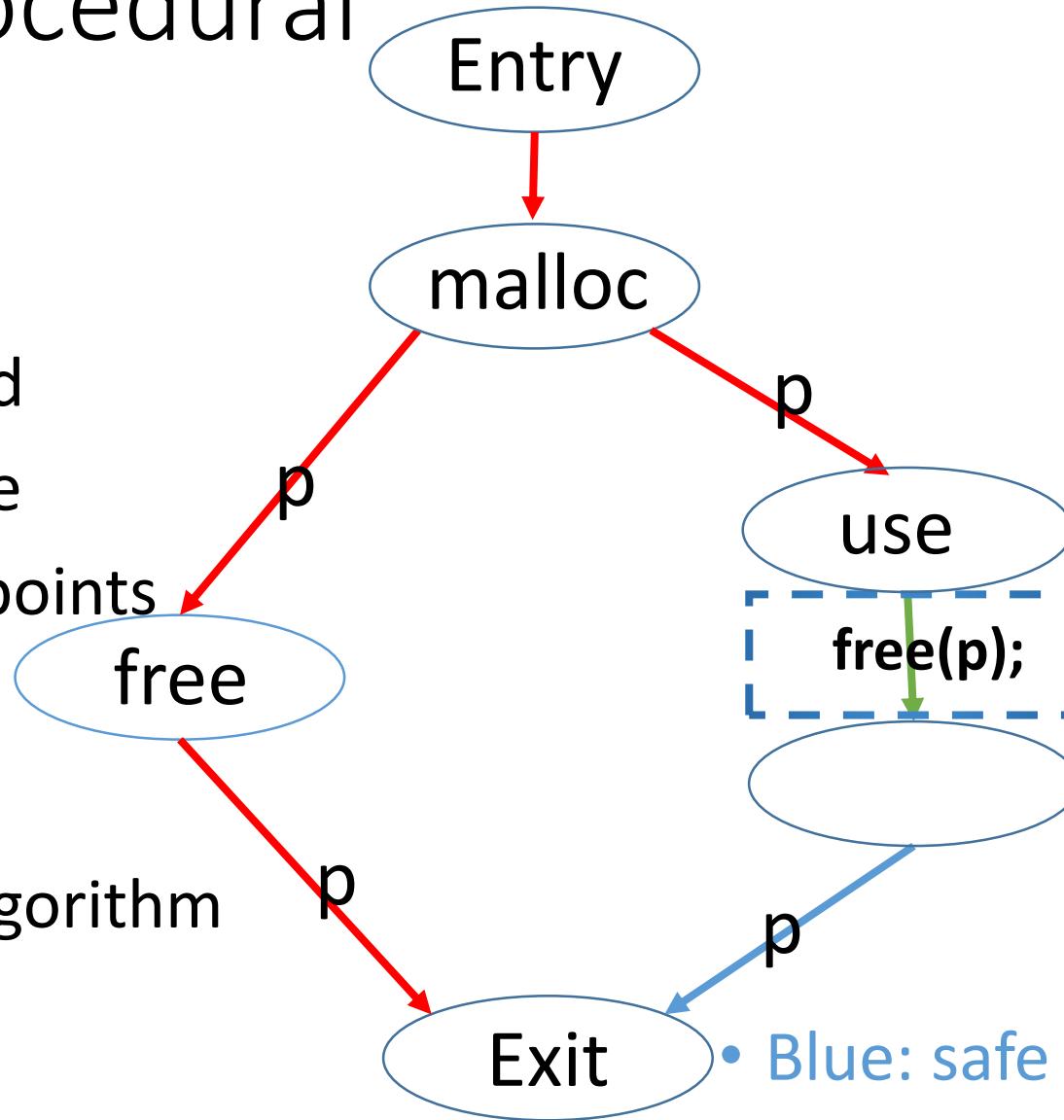
- 4. Forward
- Determine early free points
- Greedy algorithm





Intra-procedural analysis

- 4. Forward
- Determine early free points



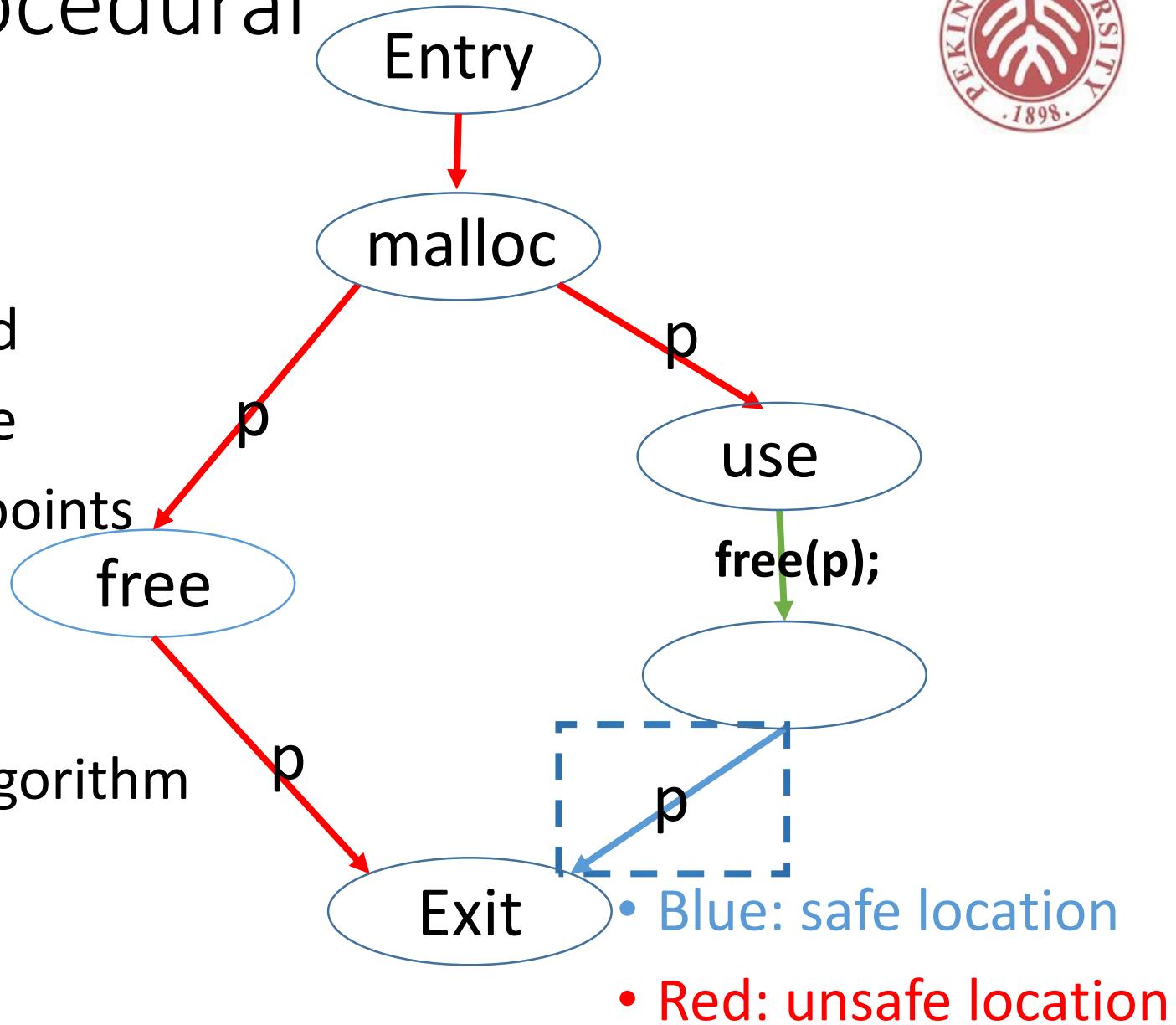
- Greedy algorithm

- Blue: safe location
- Red: unsafe location



Intra-procedural analysis

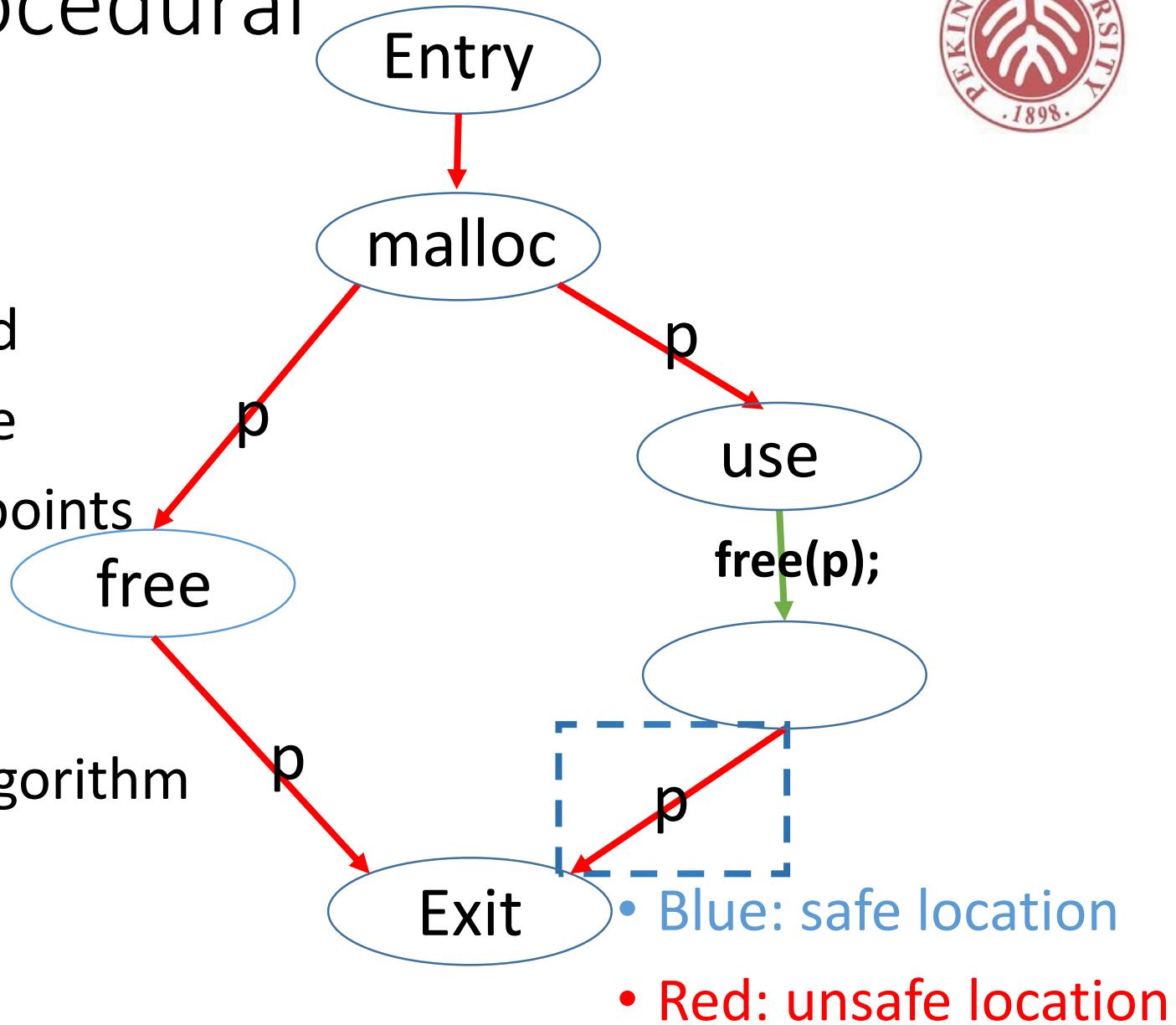
- 4. Forward
- Determine early free points
- Greedy algorithm





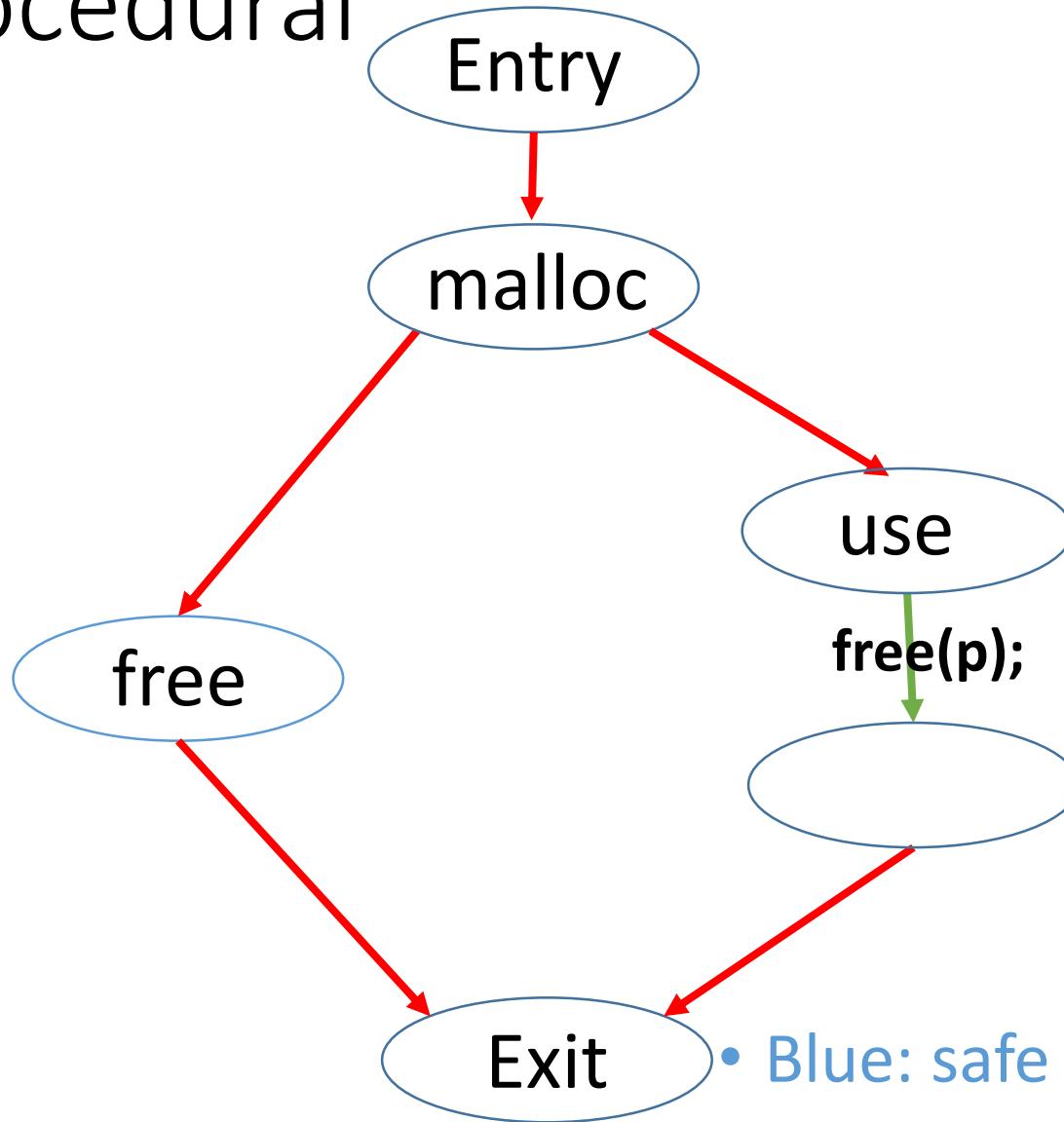
Intra-procedural analysis

- 4. Forward
- Determine early free points
- Greedy algorithm





Intra-procedural analysis



- Blue: safe location
- Red: unsafe location



More Complicated Cases



Inter-procedure

- Malloc, free, use elements are method calls
- Solution: Build summary for each method

```
1 void f(int b){  
2     int p=(int*)malloc(sizeof(int));  
3     if (b==0){  
void g(int *p){  
    free(p);  
}  
    }  
    else{  
void h(int *p){  
    *p=1;  
}  
    }  
    b=0;  
}  
}
```

A red arrow points from the number 4 to the line "g(p);". Another red arrow points from the number 7 to the line "h(p);".



Inter-procedure

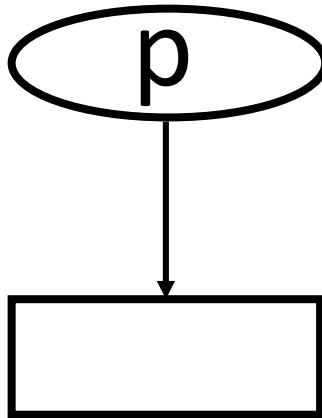
- Build summaries for each function
 - Summarize the allocation, use, free, escape information
 - Iteratively update the callers'
- Analyze Intra-procedurally



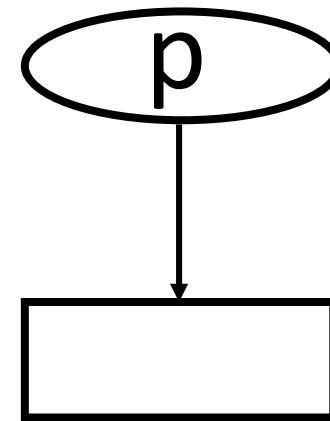
Building summaries

- Method type for each memory chunk
 - Allocation (A)
 - Free (F)
 - Use (U)
 - Escape (E)

```
void h(int *p){  
    *p=1;  
}
```



```
void g(int *p){  
    free(p);  
}
```





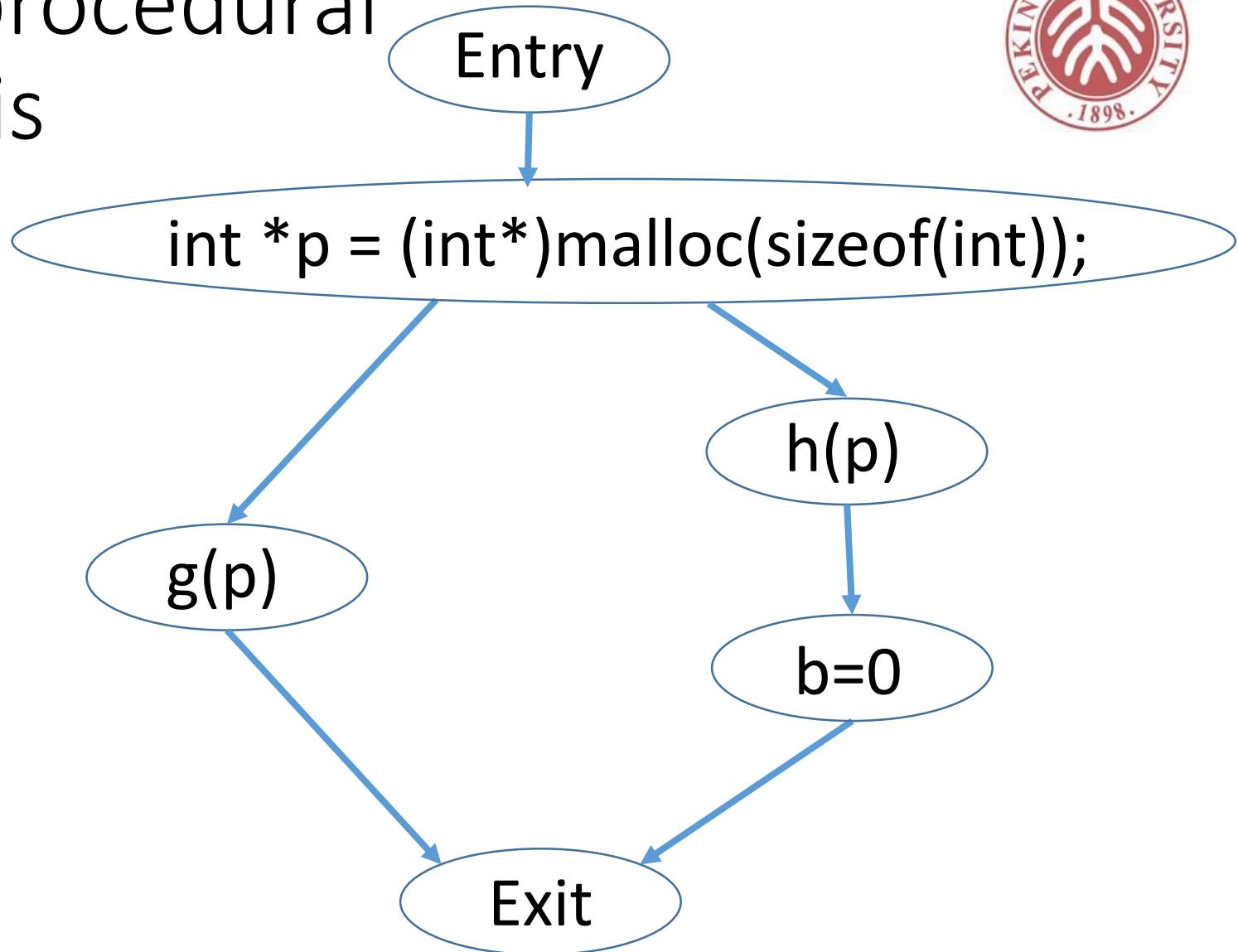
Inter-procedure

- Scan each statement
- Consult the summary

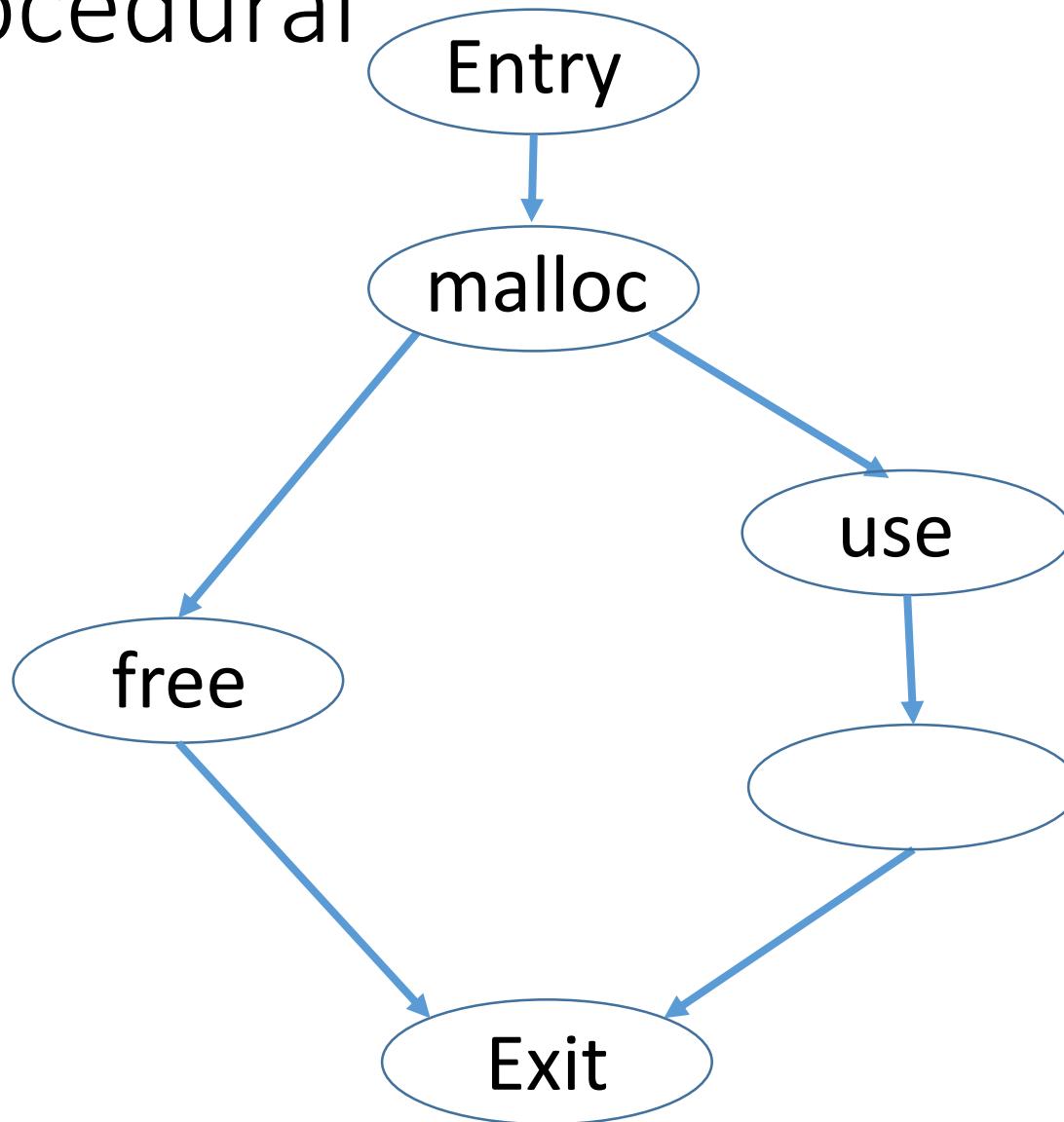
```
1 void f(int b){  
2     int p=(int*)malloc(sizeof(int));  
3     if (b==0){  
4         g(p);  
5     }  
6     else{  
7         h(p);  
8         b=0;  
9     }  
10 }
```

A red arrow points from the number 4 to the call to g(p) in the first code block. Another red arrow points from the number 7 to the call to h(p) in the second code block.

Intra-procedural analysis



Intra-procedural analysis



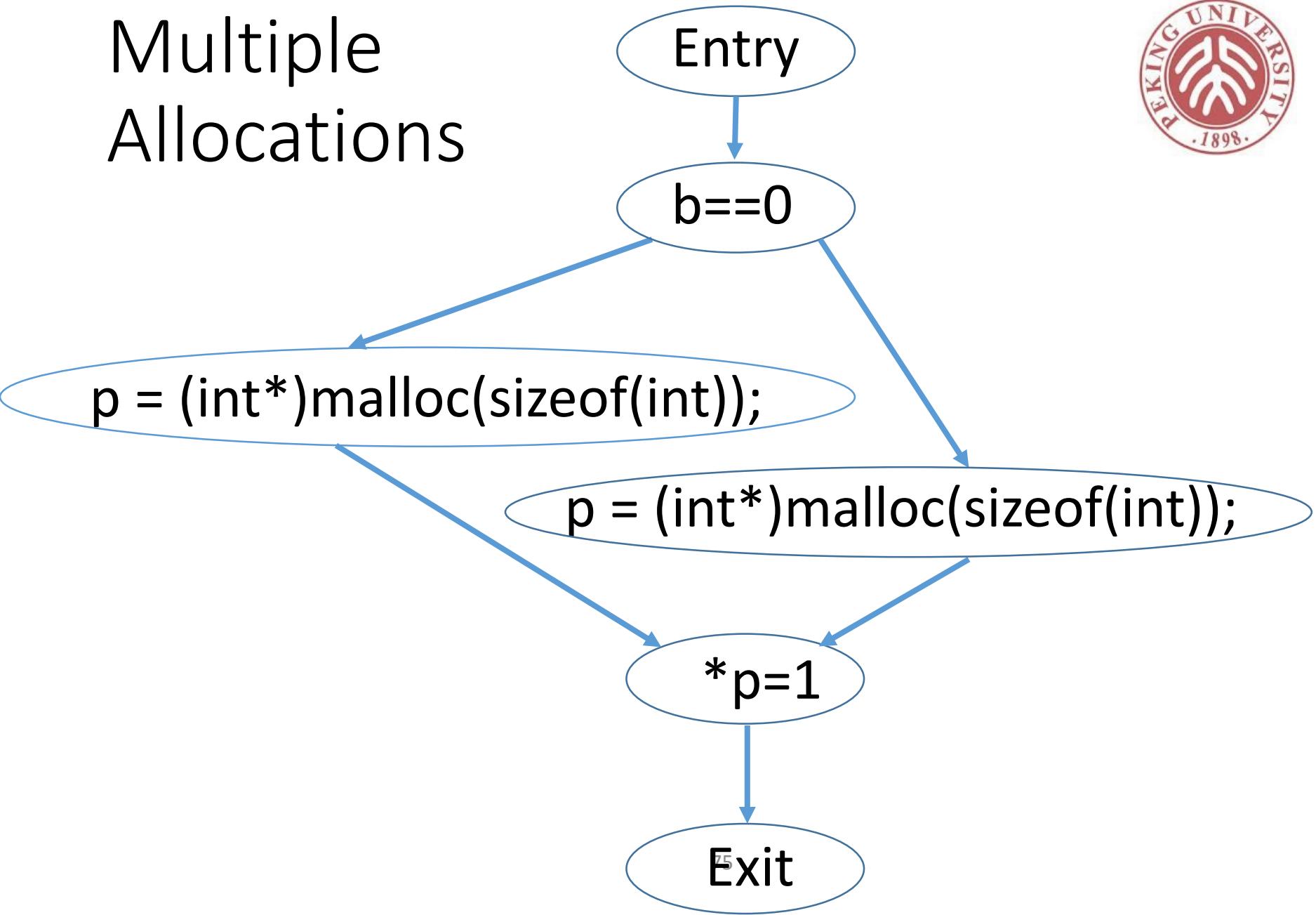


Multiple Allocations

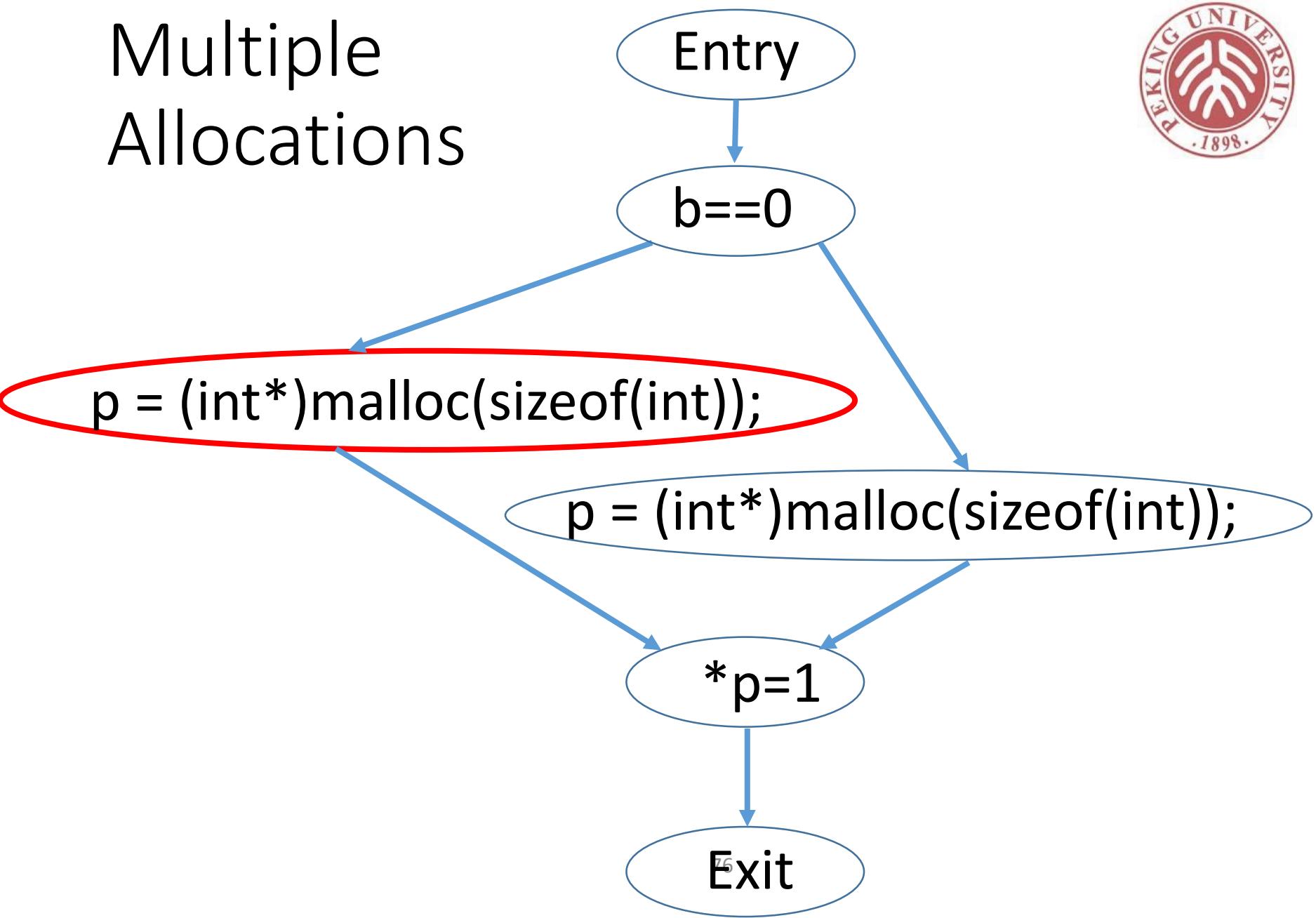
- Multiple allocations are used as one allocation
- Solution: set-based edge condition on CFG edges, instead of blue-red binary

```
1 void f(int b){  
2     int *p;  
3     if (b==0){  
m1 ← 4         p=(int*)malloc(sizeof(int));  
5     }  
6     else{  
m2 ← 7         p=(int*)malloc(sizeof(int));  
8     }  
use ← 9         *p=1;  
10 }
```

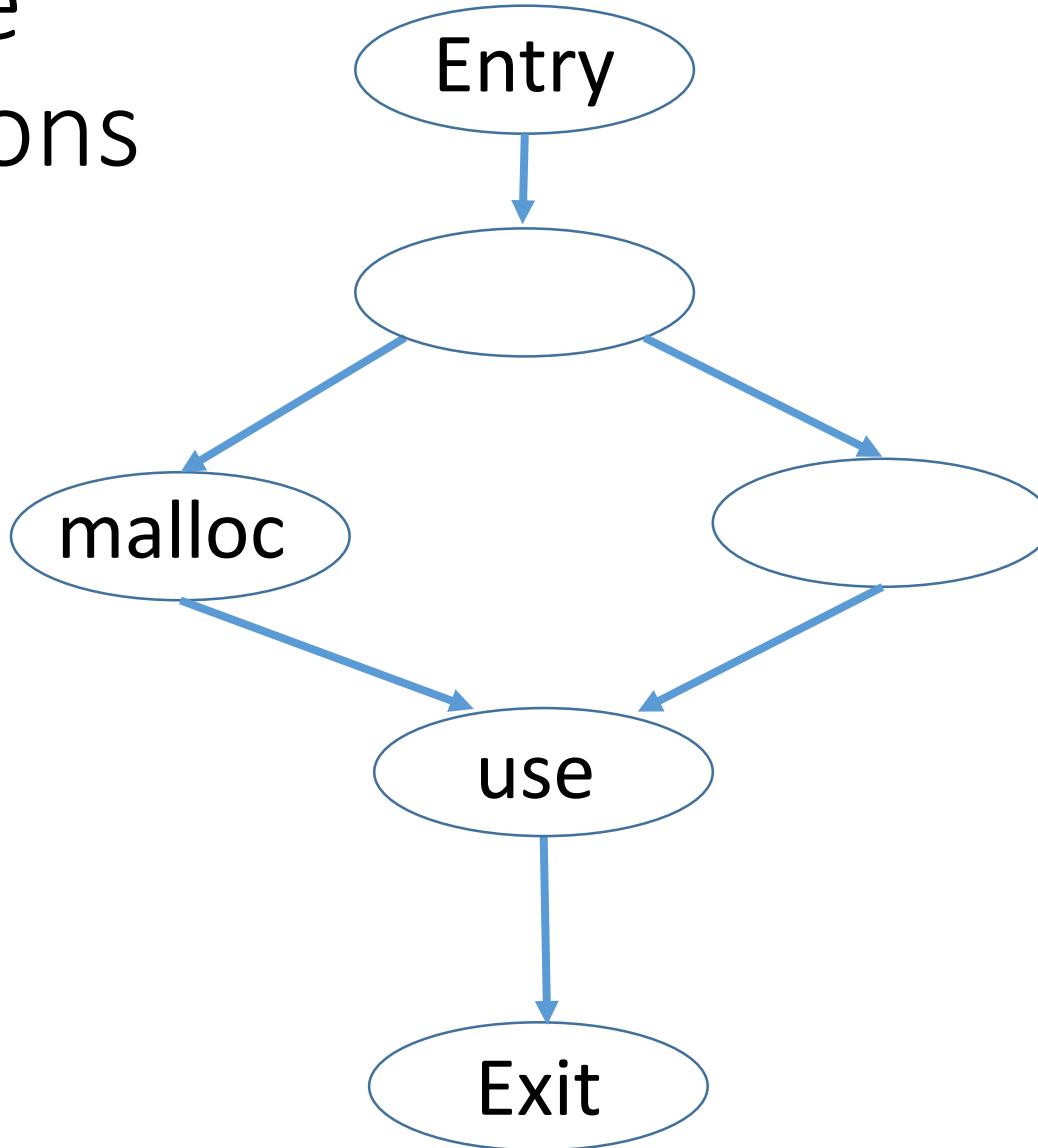
Multiple Allocations



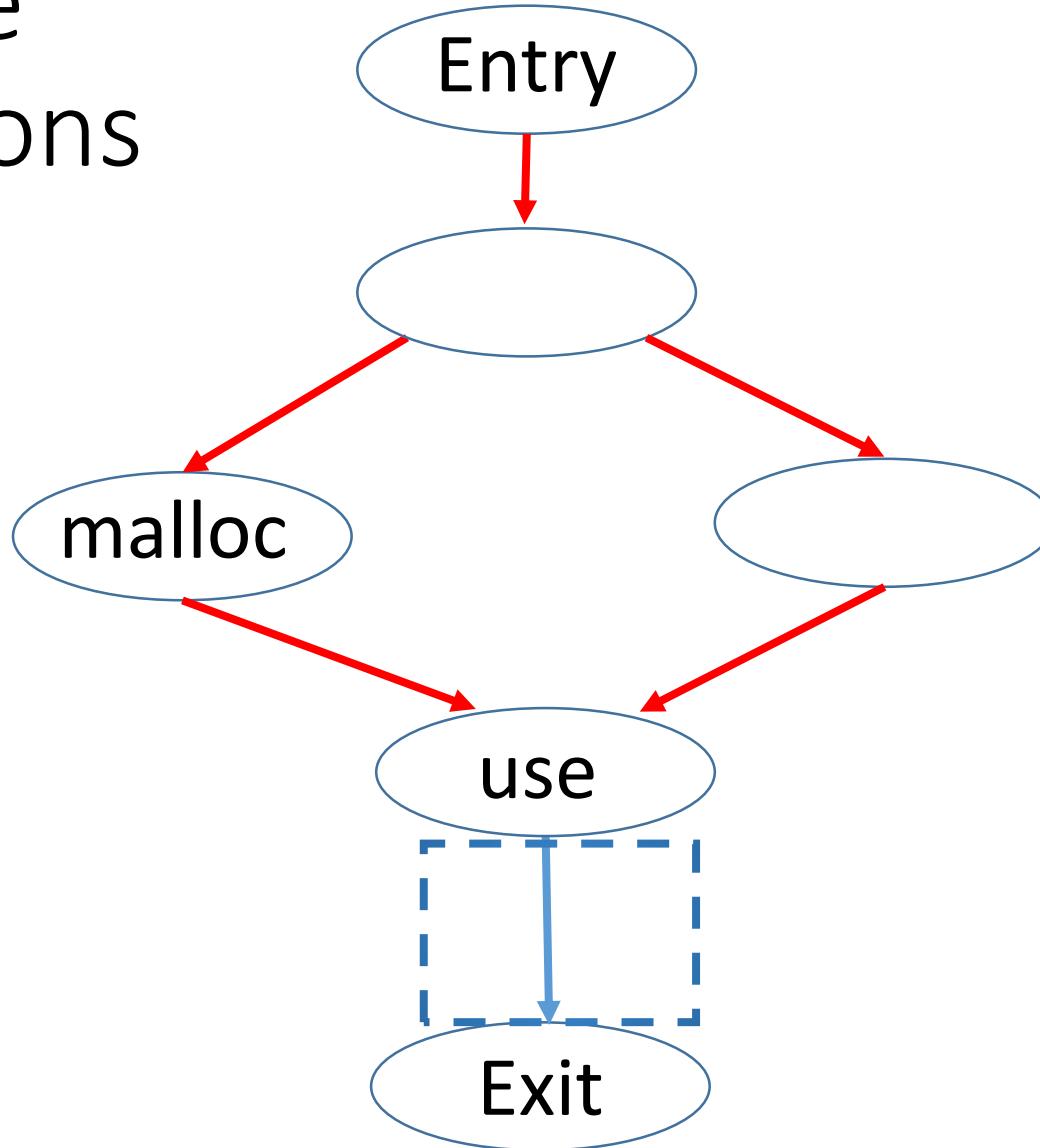
Multiple Allocations



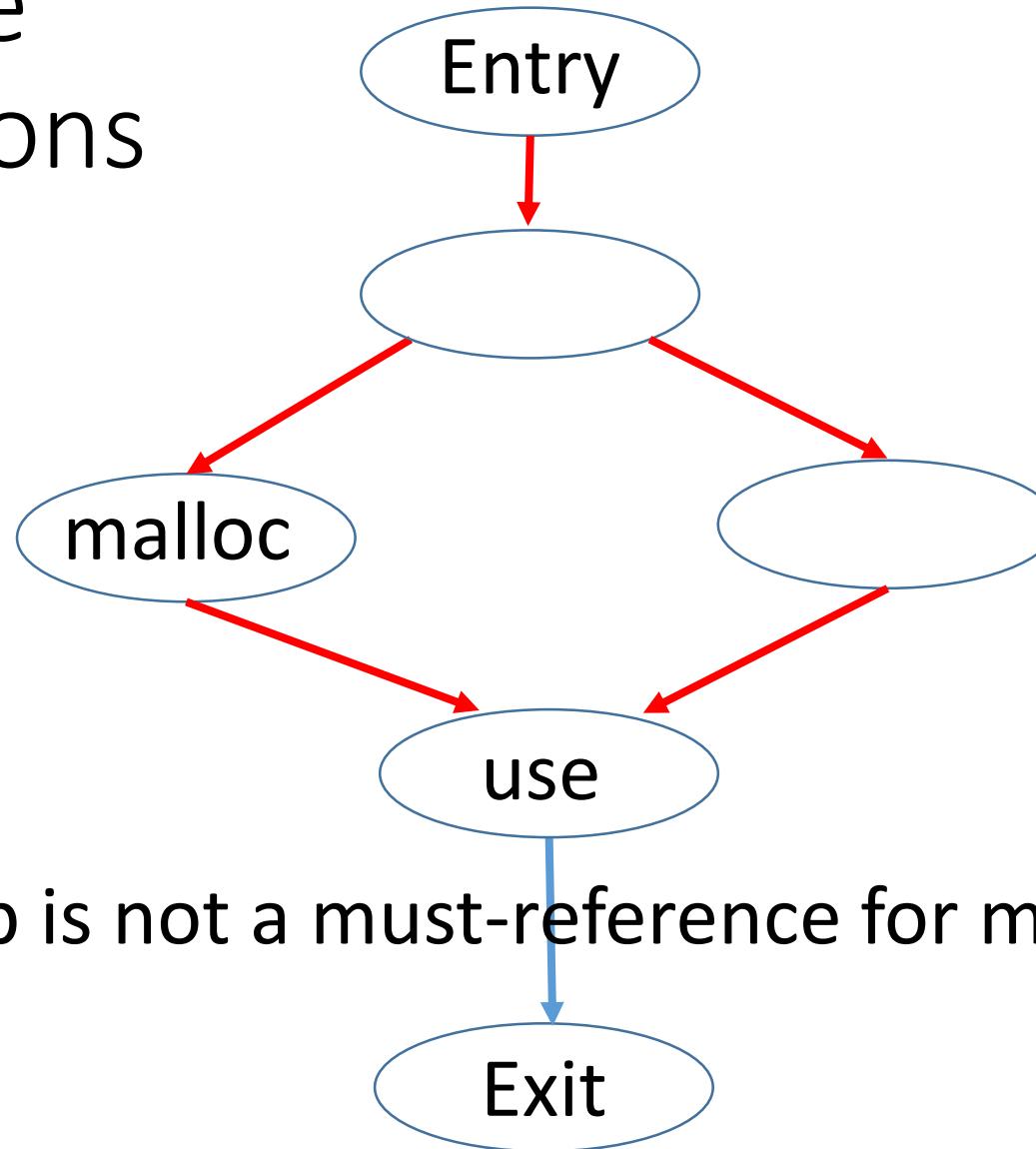
Multiple Allocations



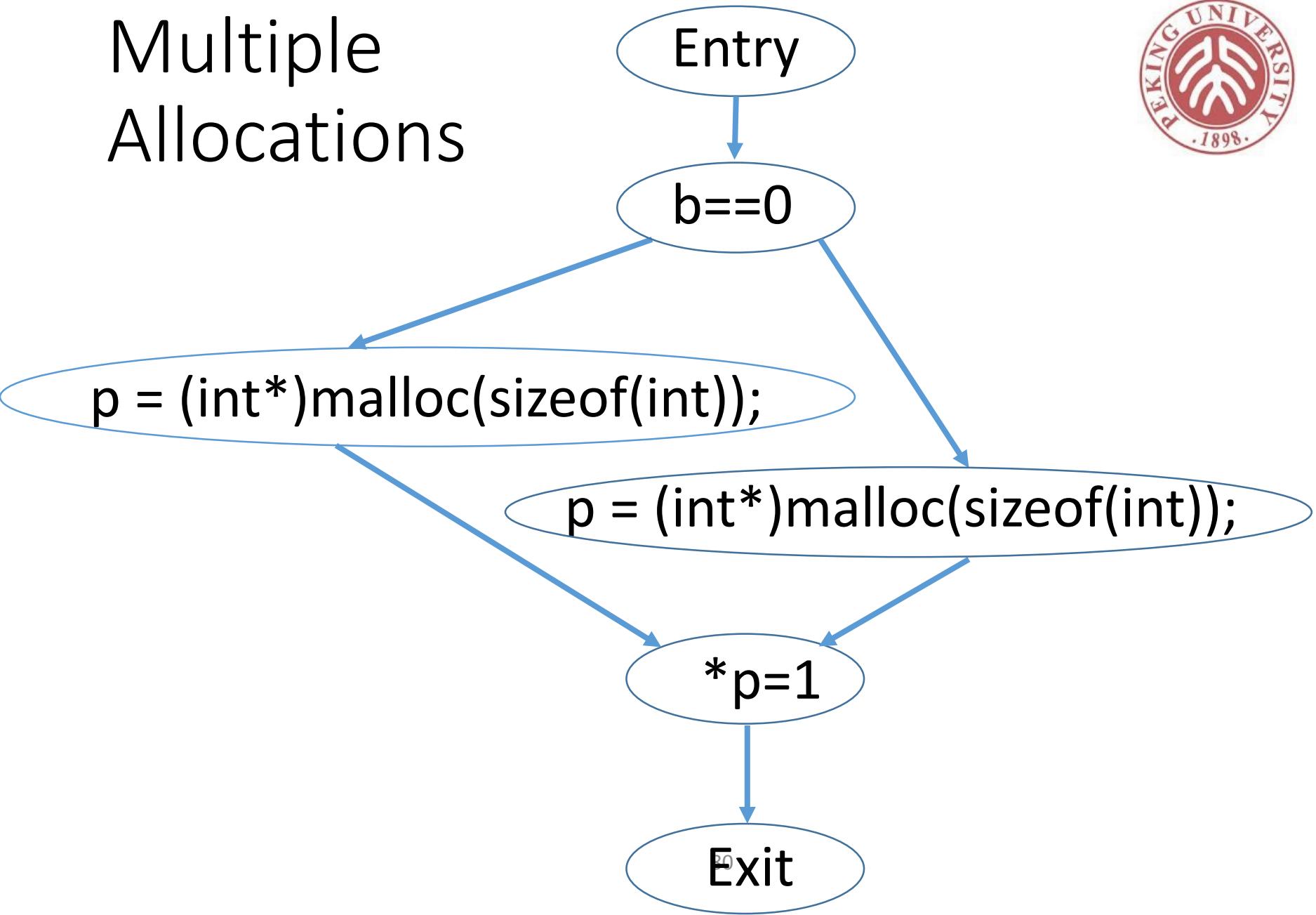
Multiple Allocations



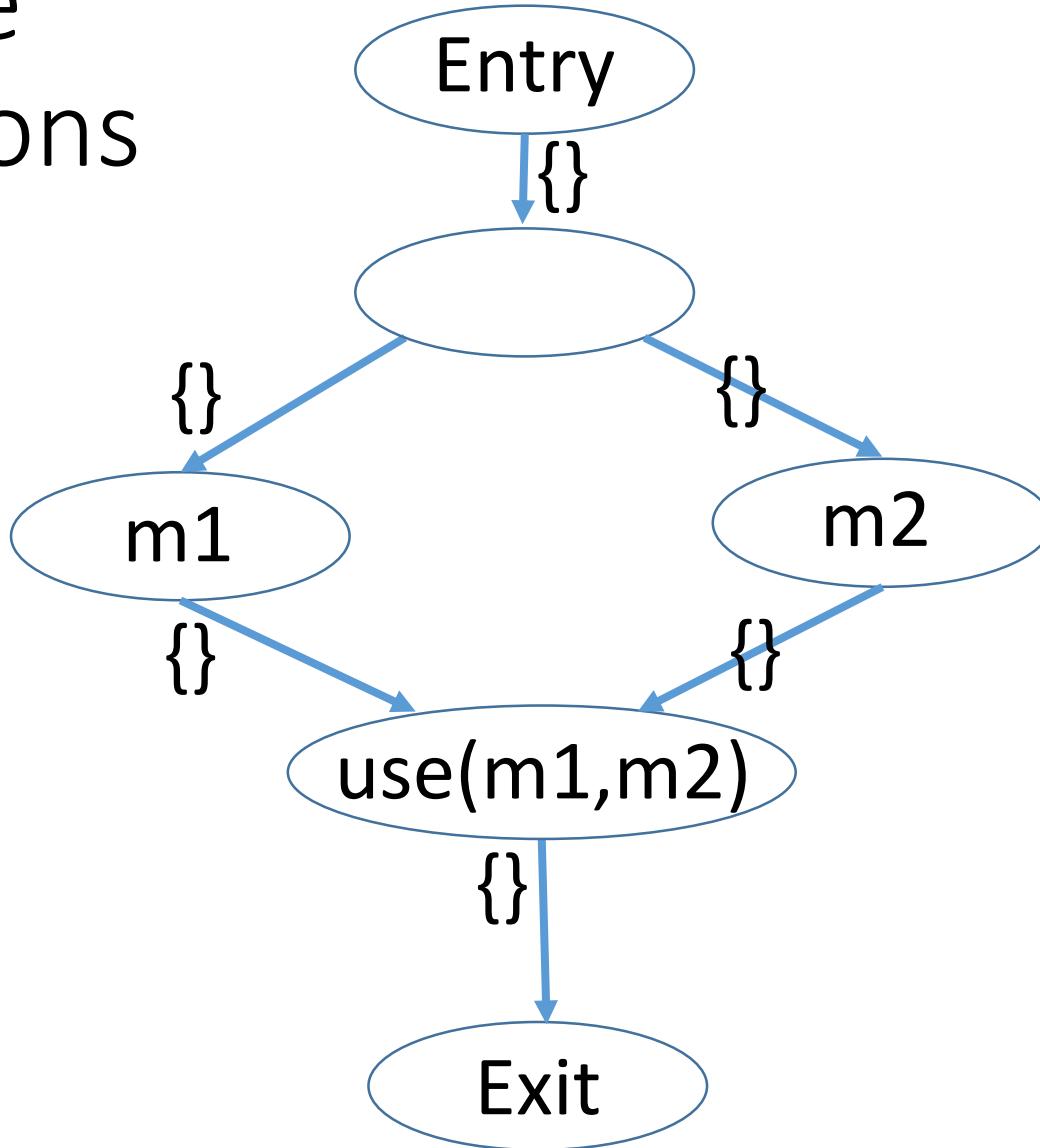
Multiple Allocations



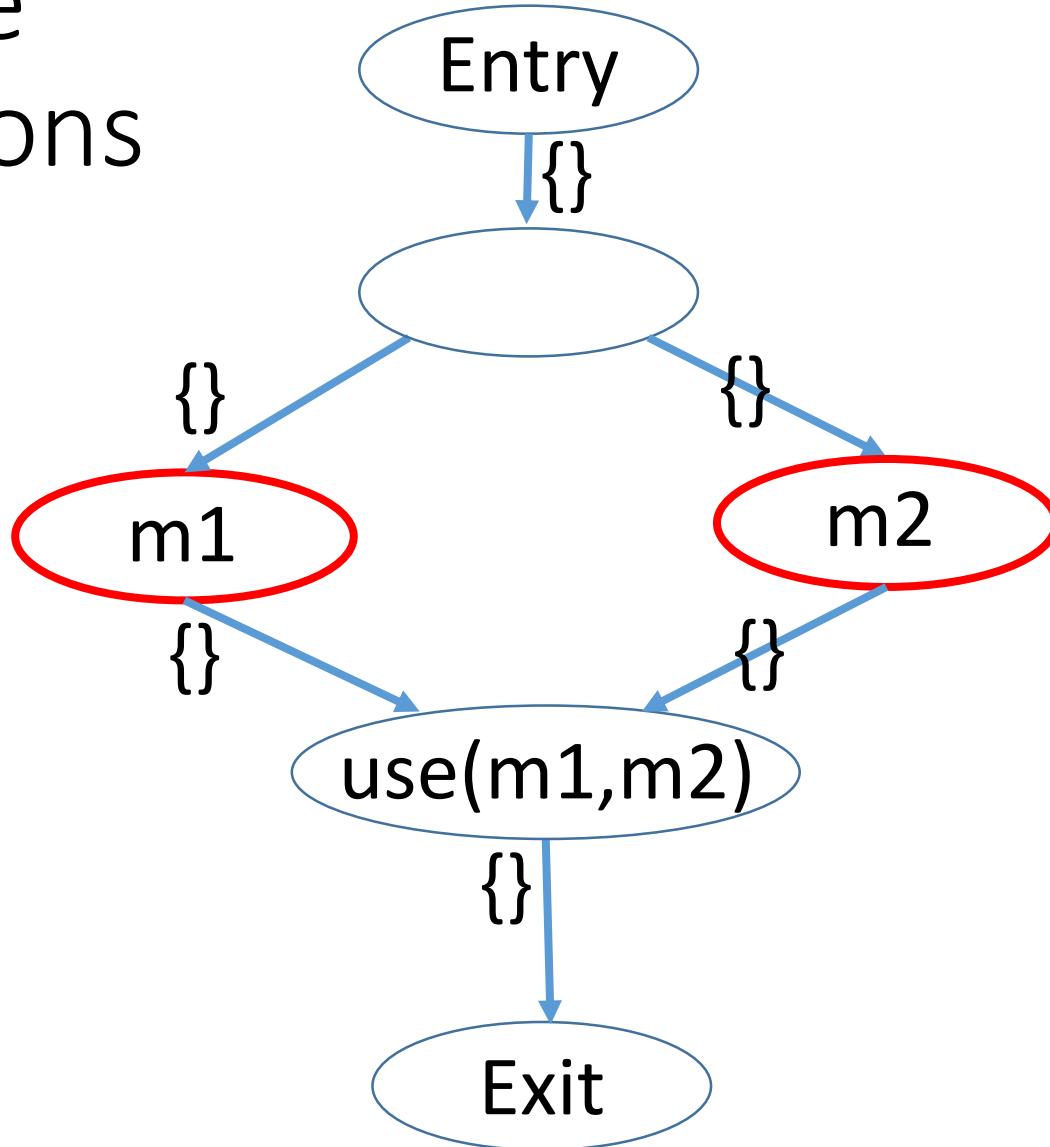
Multiple Allocations



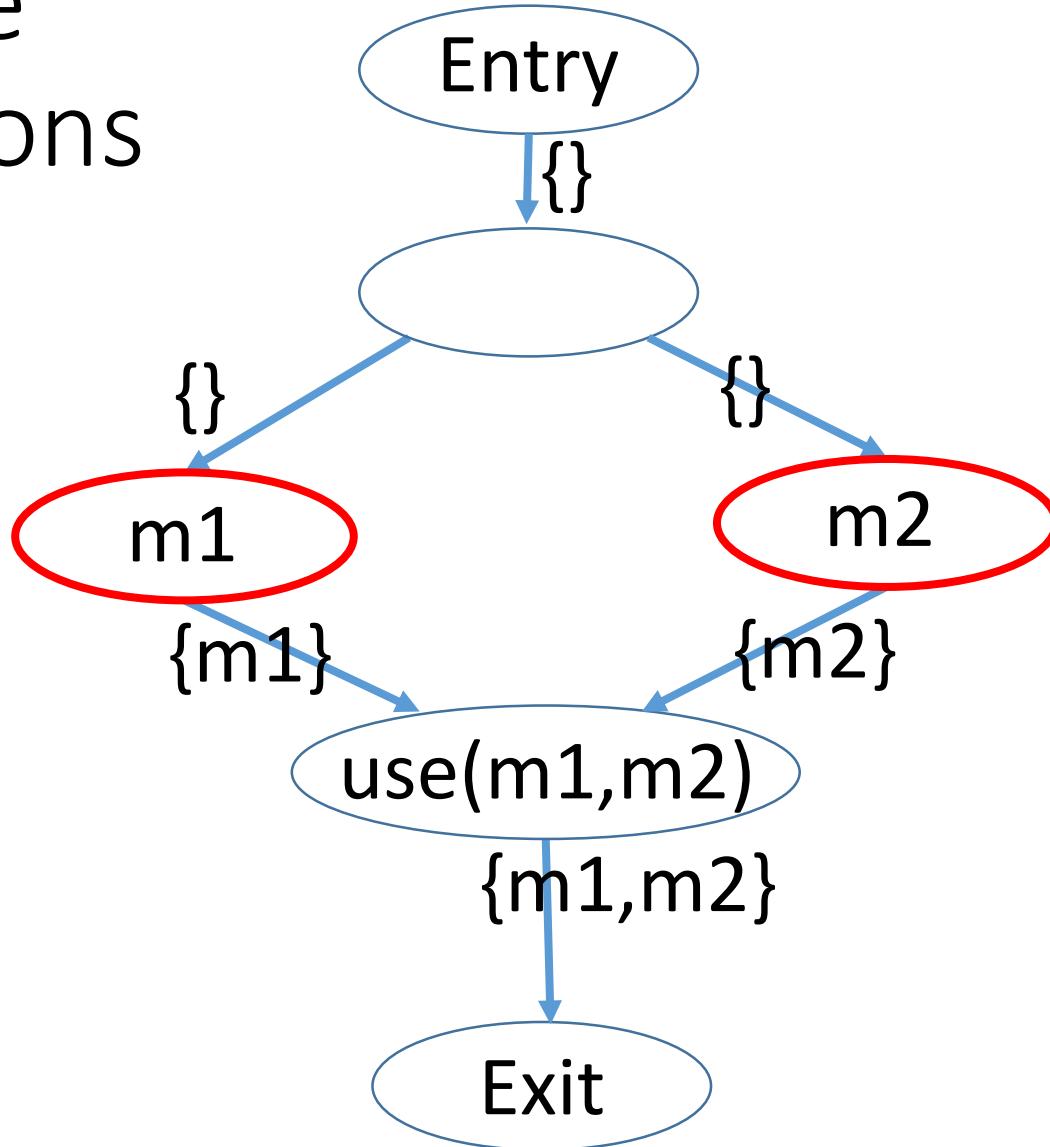
Multiple Allocations



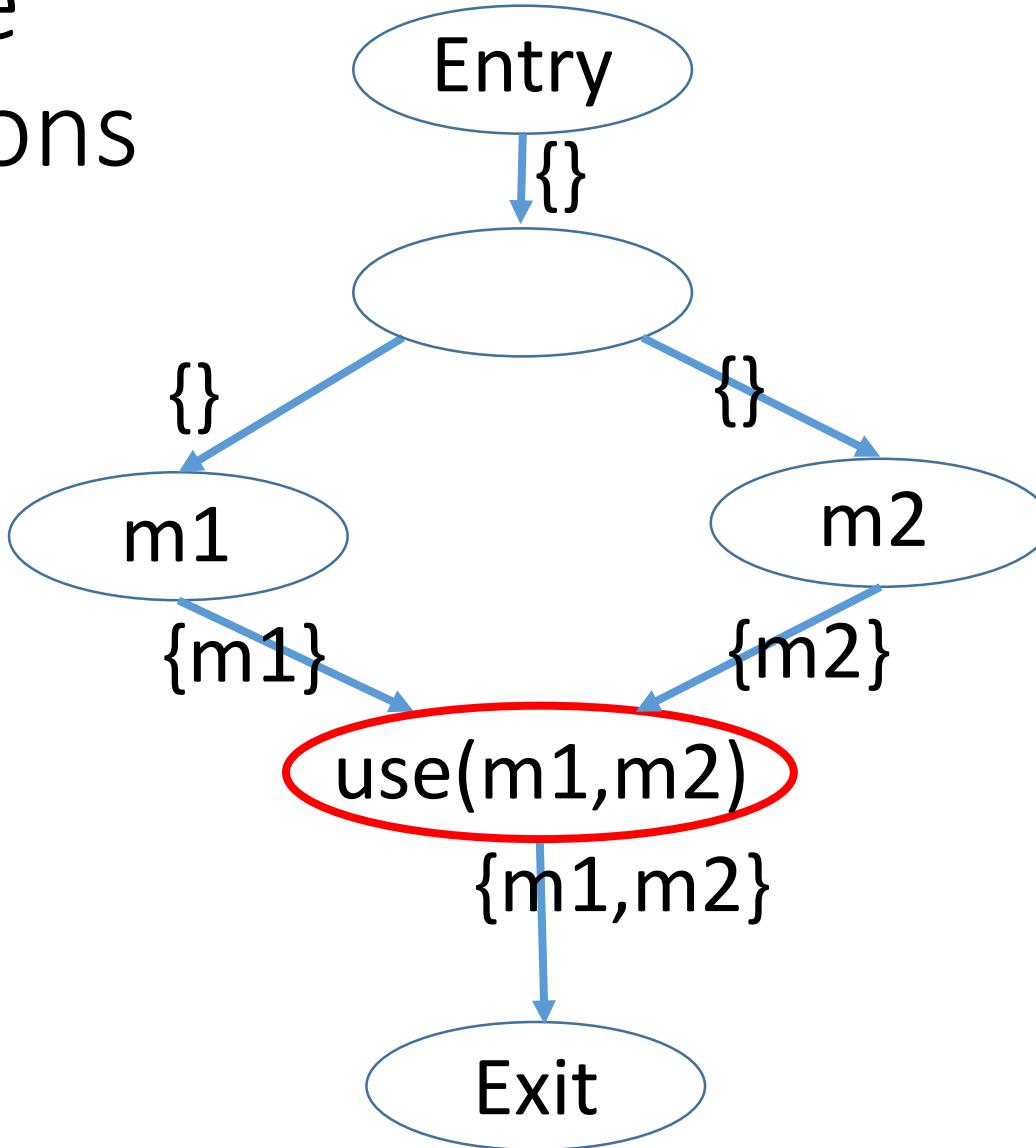
Multiple Allocations



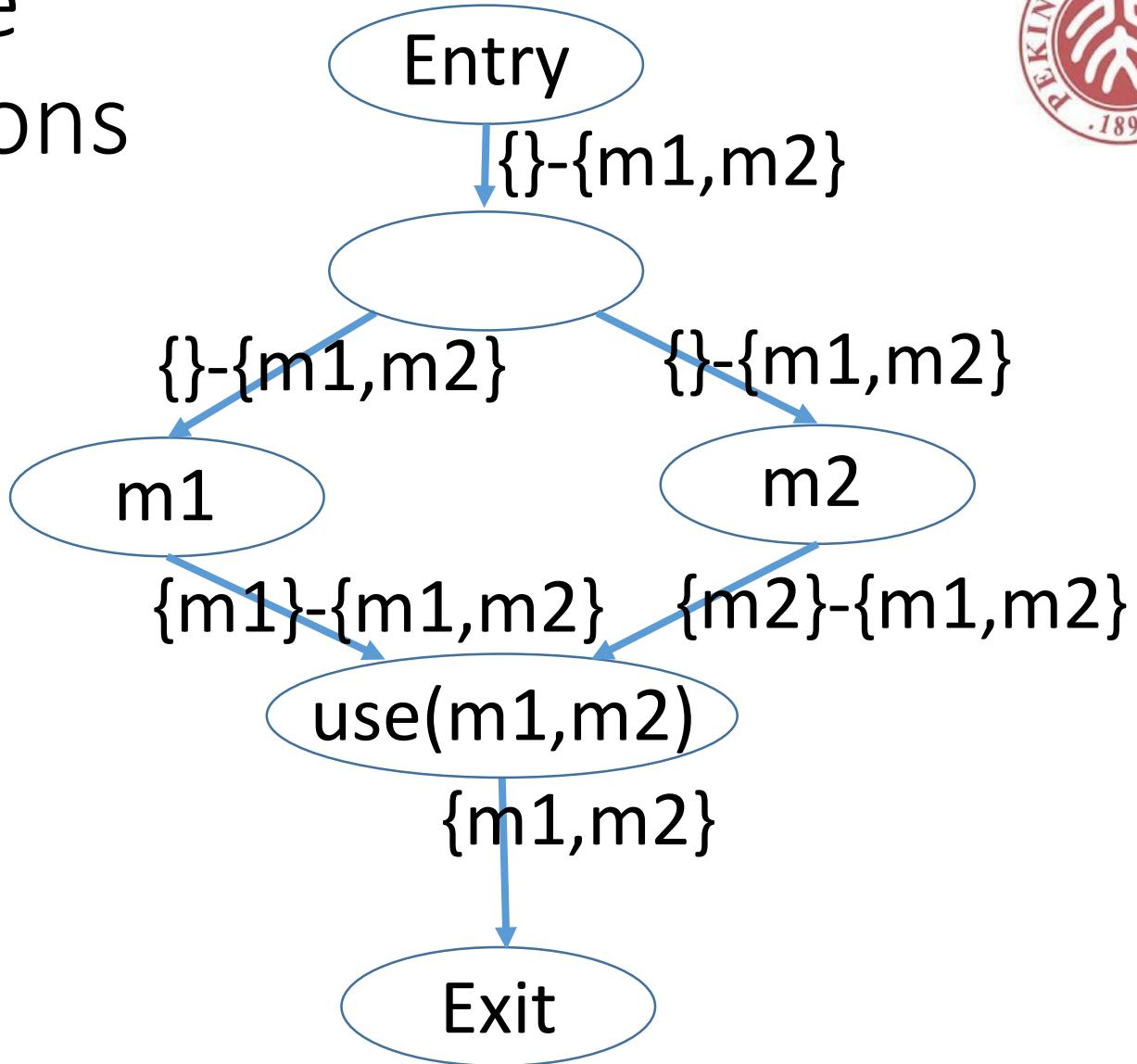
Multiple Allocations



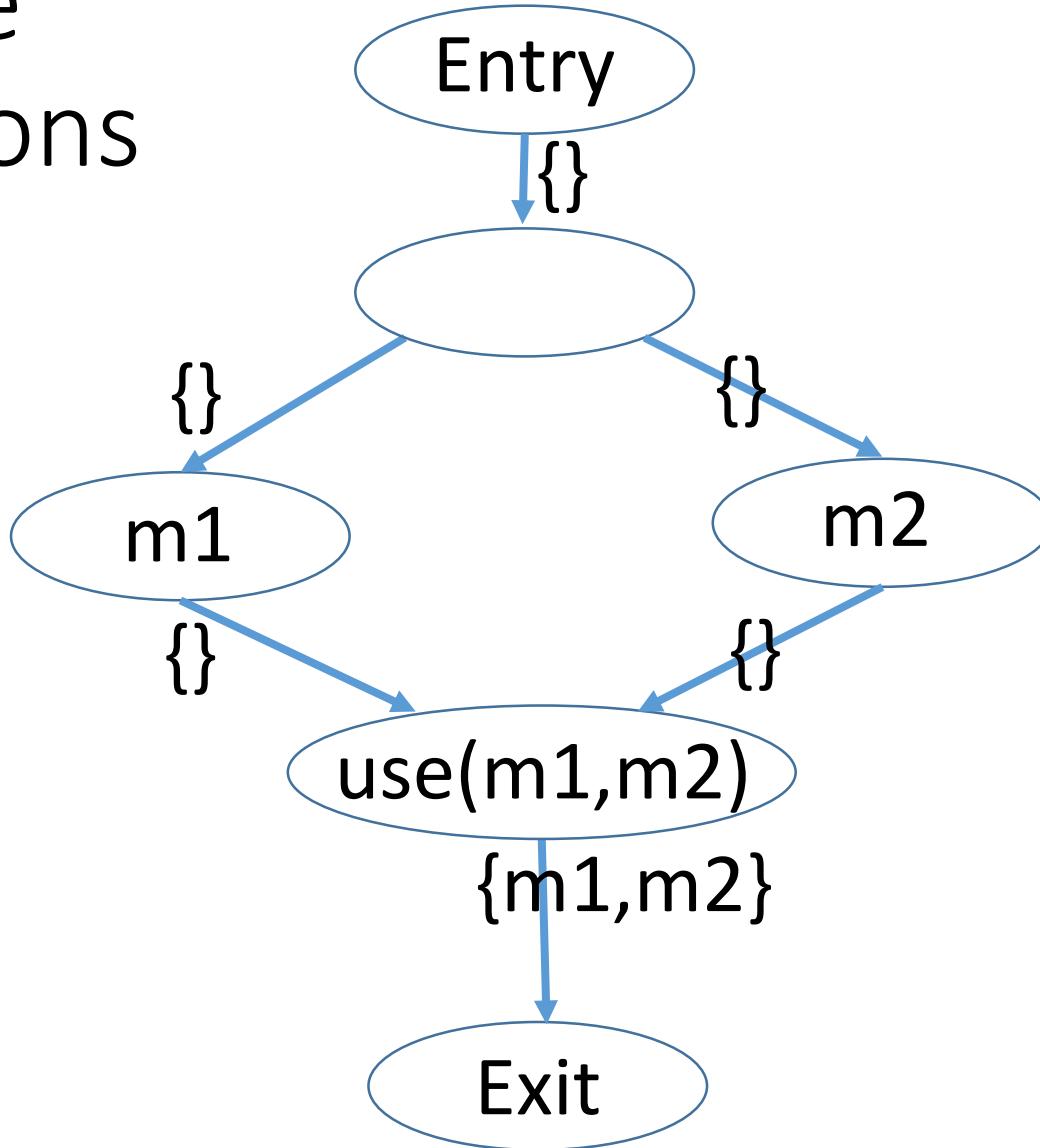
Multiple Allocations



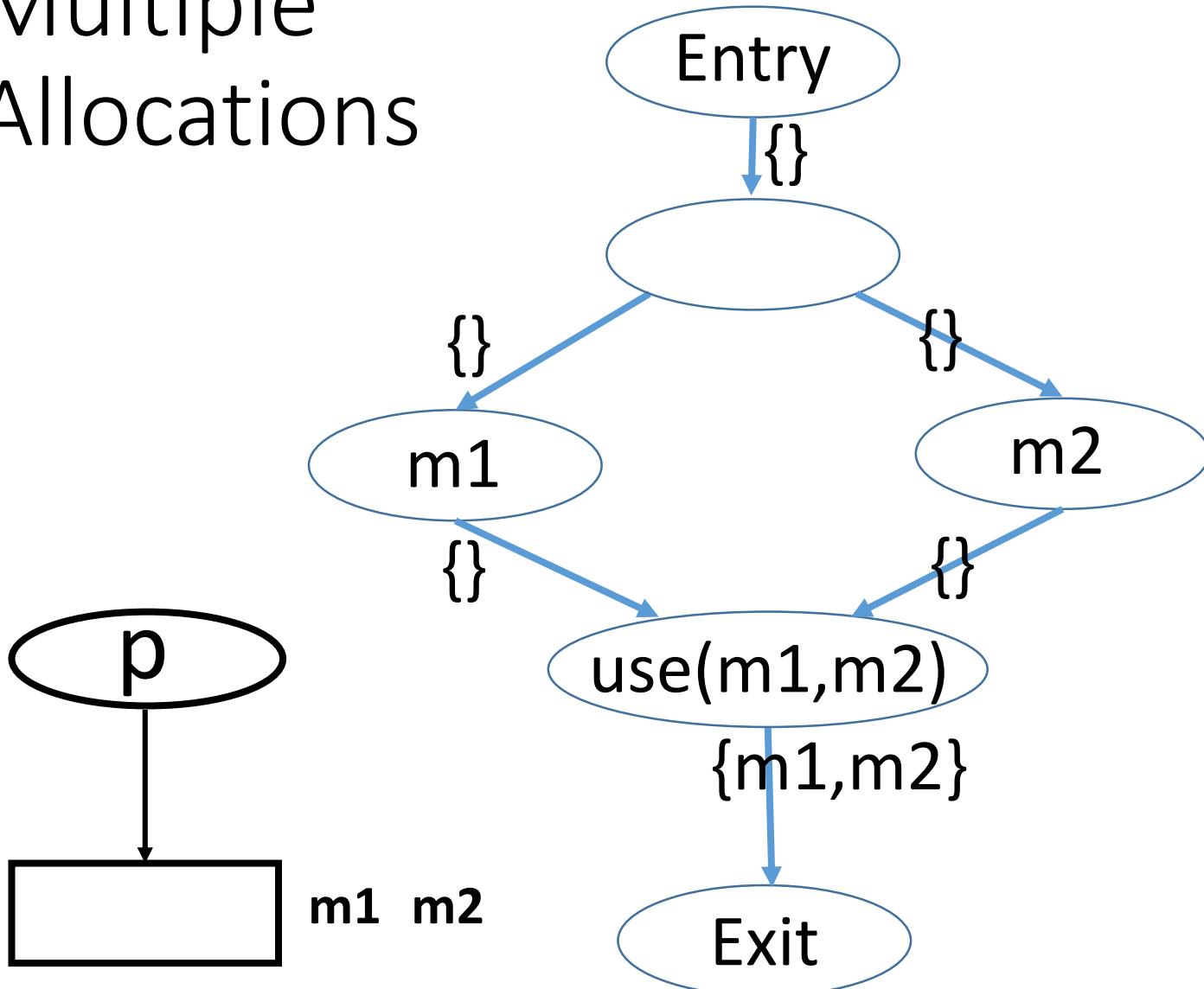
Multiple Allocations



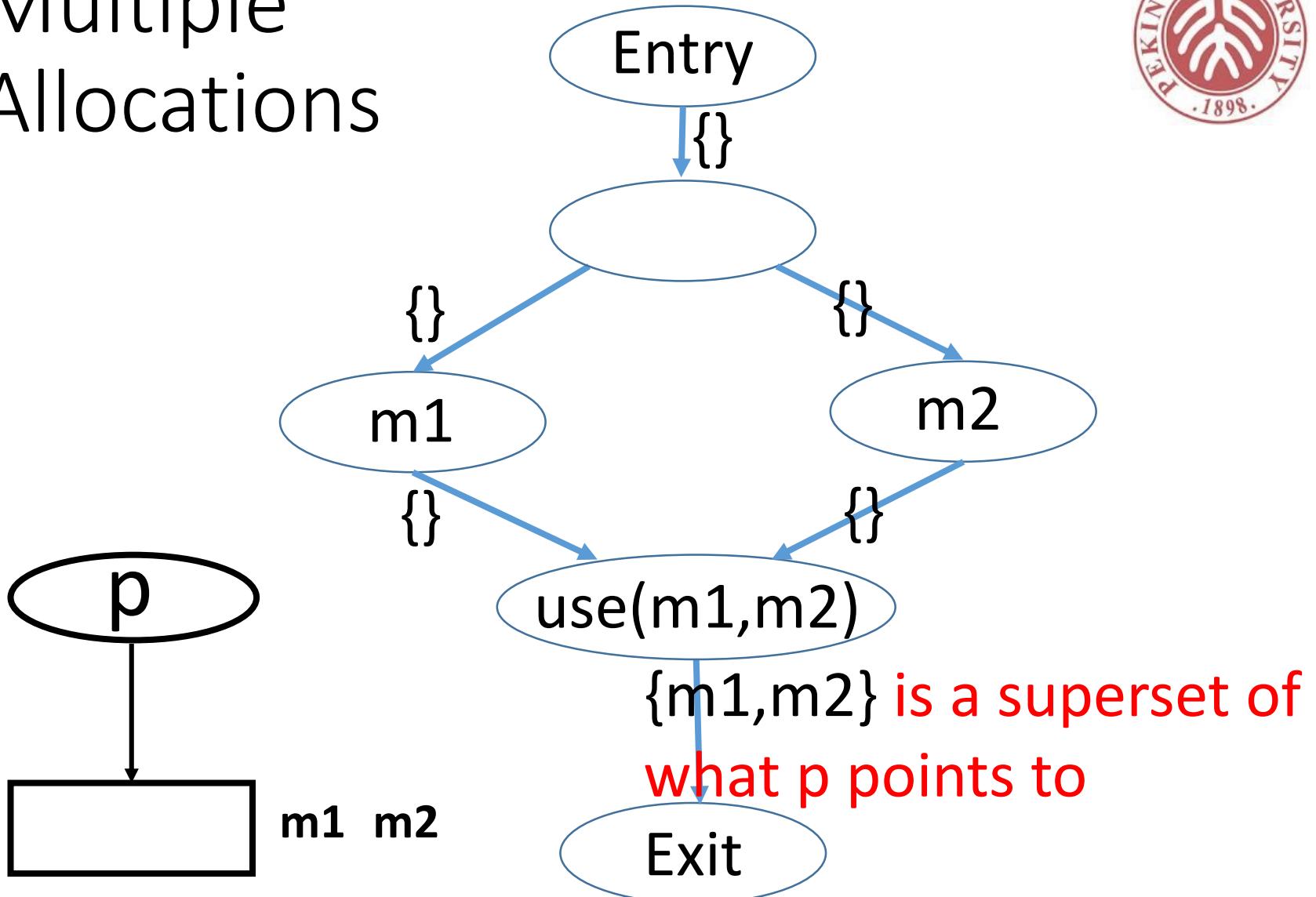
Multiple Allocations



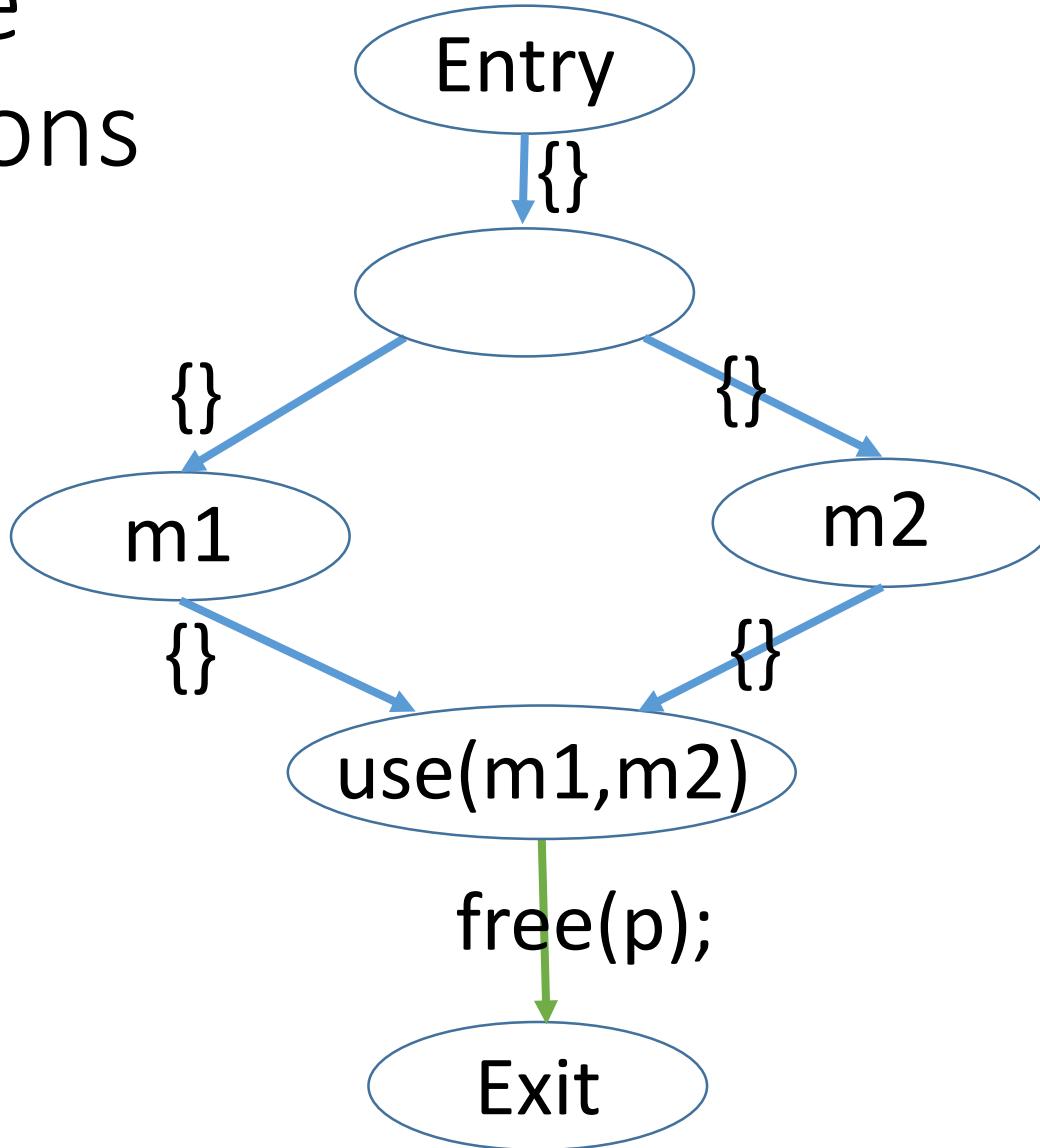
Multiple Allocations



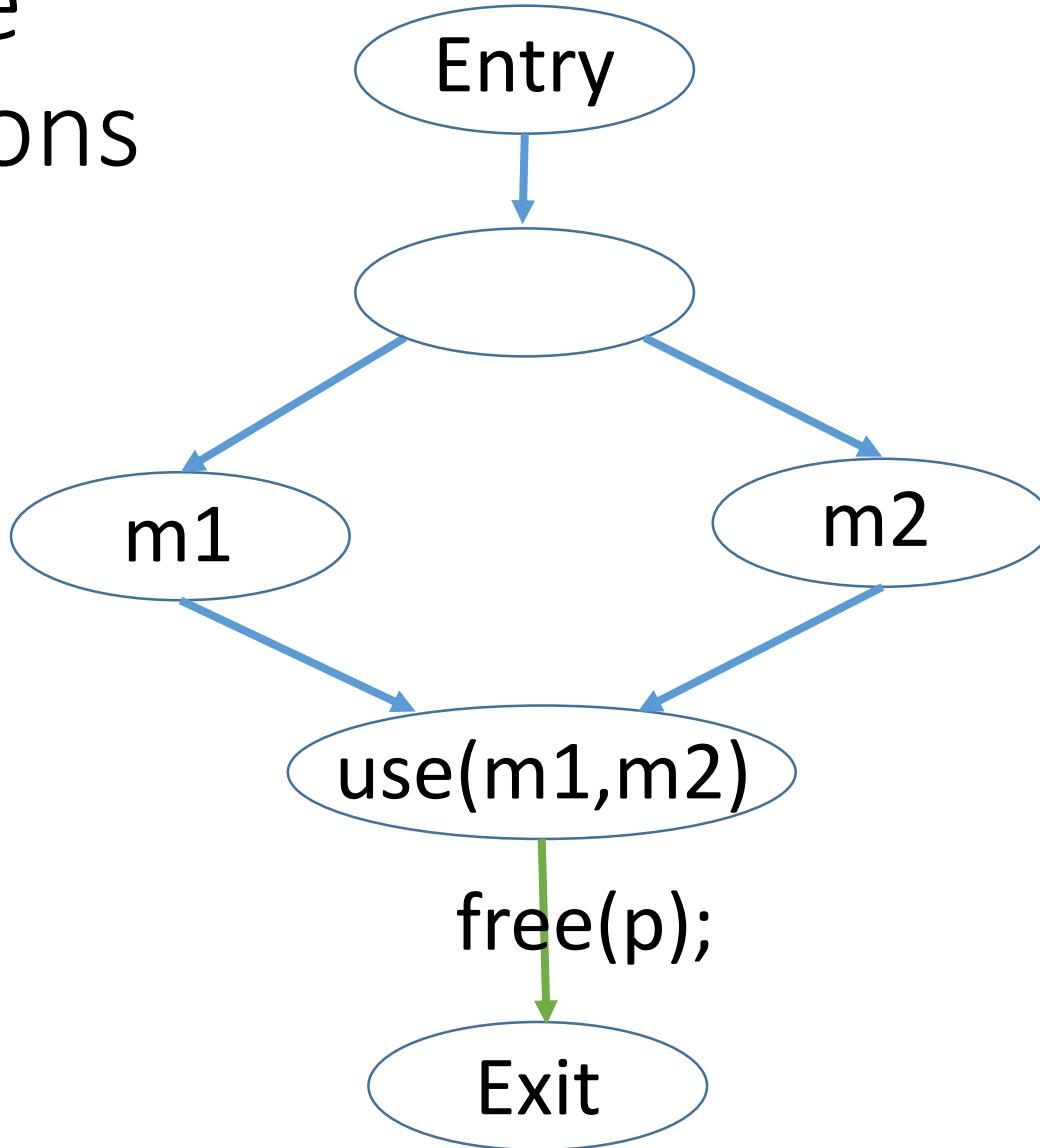
Multiple Allocations



Multiple Allocations



Multiple Allocations





Loops

- In loops, unsafe locations are propagated all around
- Solution: Extract the loop

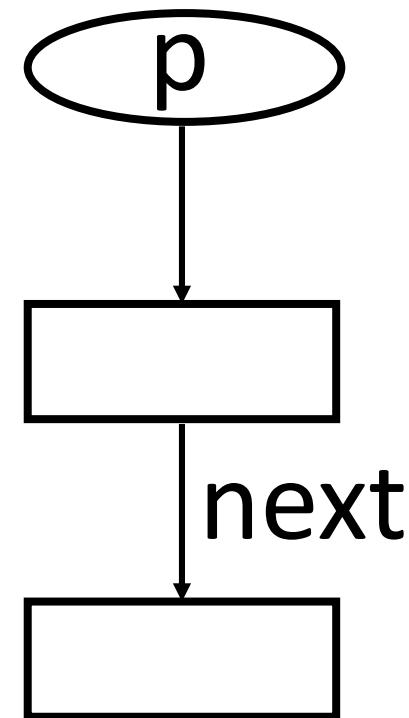
```
void f(bool b){  
    for (int i = 0; i < 10; ++i){  
        int p=(int*)malloc(sizeof(int));  
        if (b){  
            free(p);  
        }  
        else{  
            p=(int*)malloc(sizeof(int)*2);  
        }  
    }  
}
```



Heap Structure

- References for heap structure
- Solution: based on points-to graph

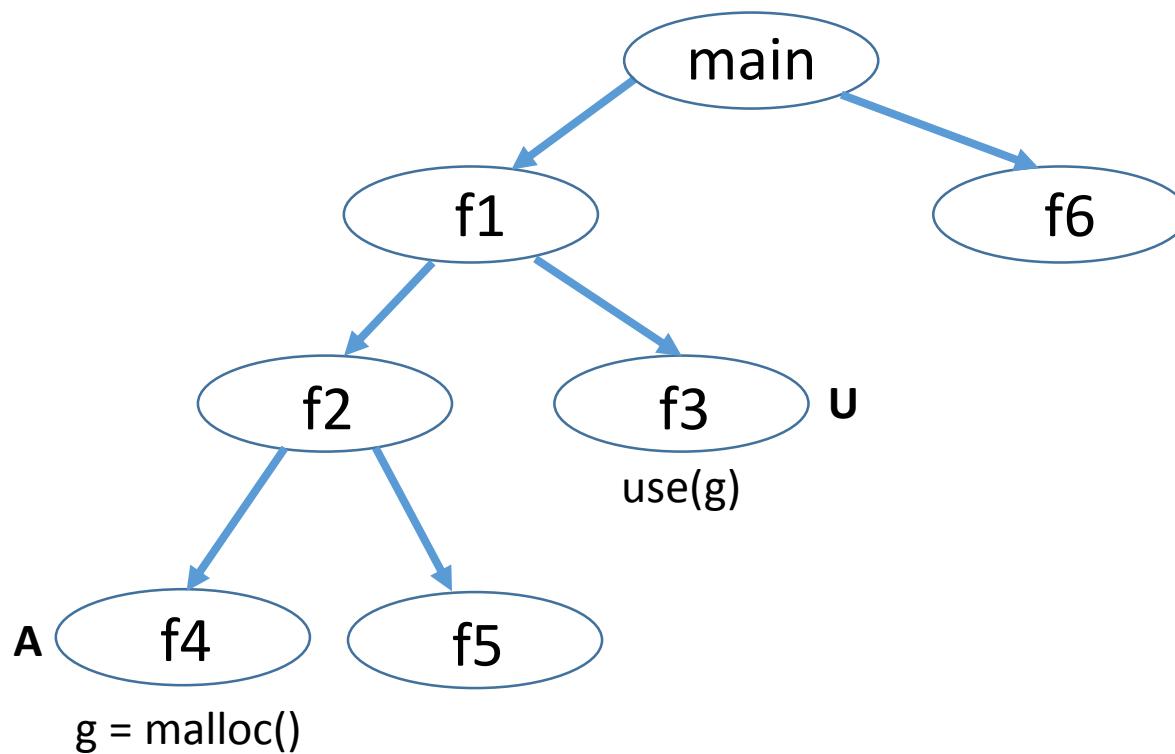
```
p->next = (int*)malloc(sizeof(int));  
if (b==0){  
    free(p->next);  
}  
else{  
    p->next=1;  
    b=0;  
}
```





Global Variables

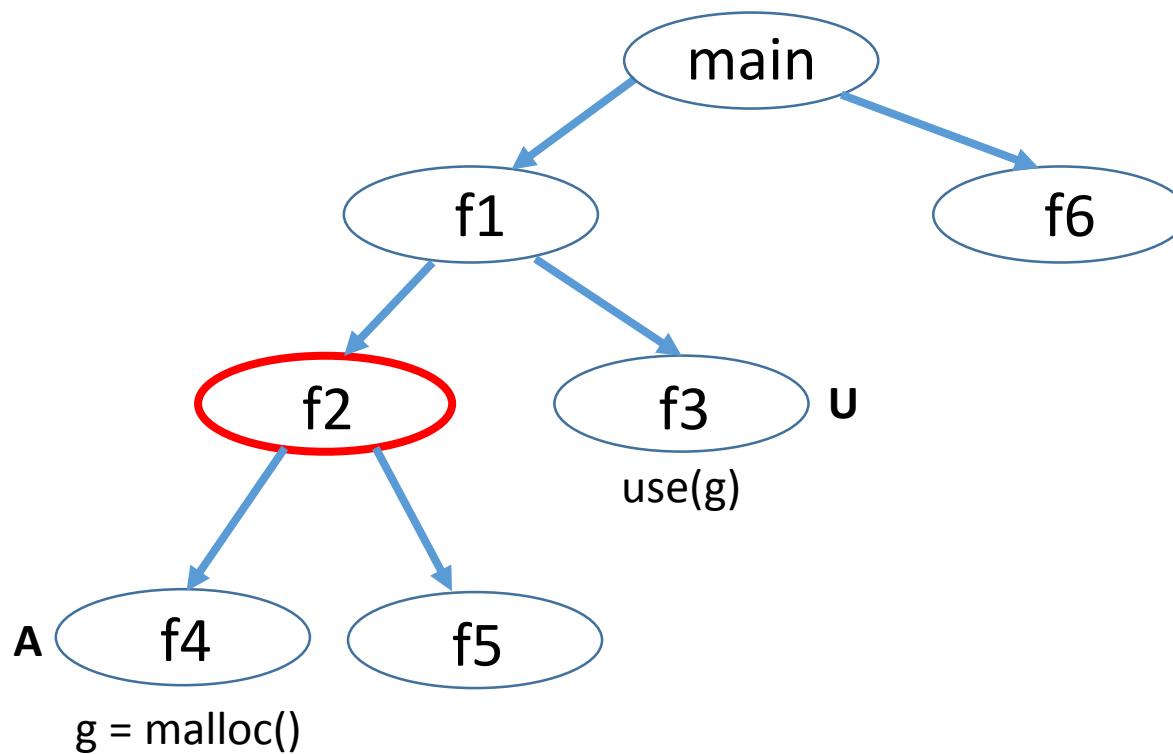
- Global variables escape from every function
- Solution: based on call graph





Global Variables

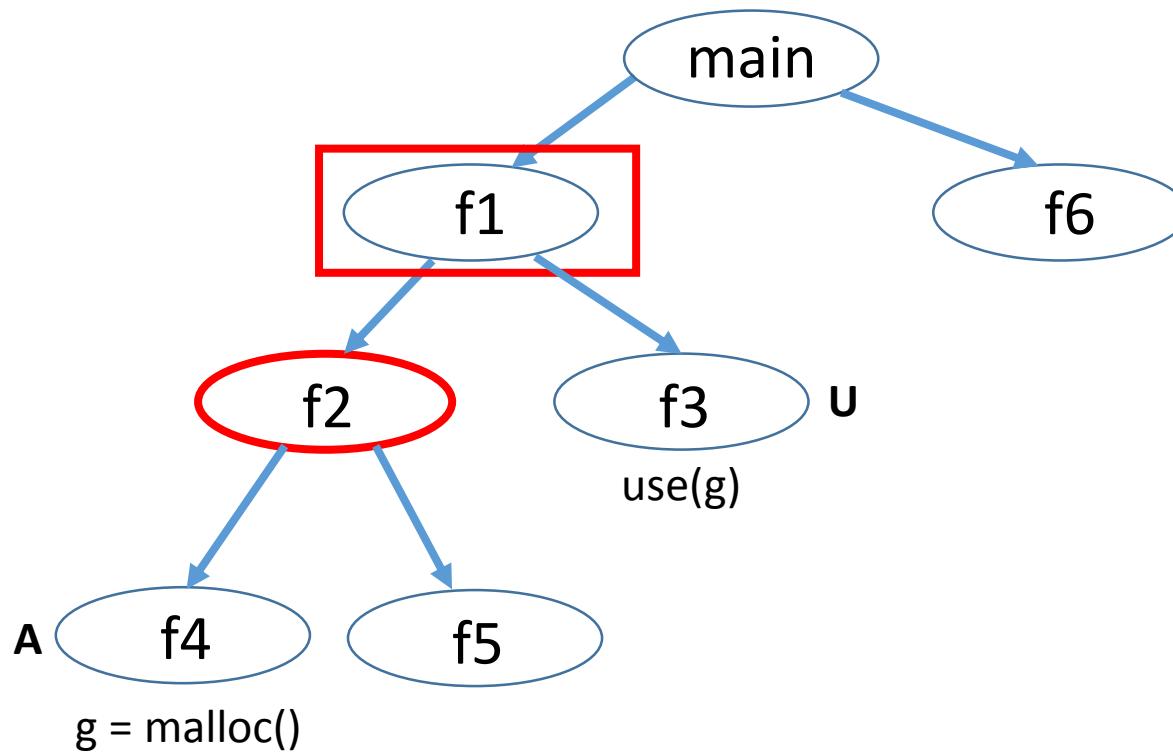
- Global variables escape from every function
- Solution: based on call graph





Global Variables

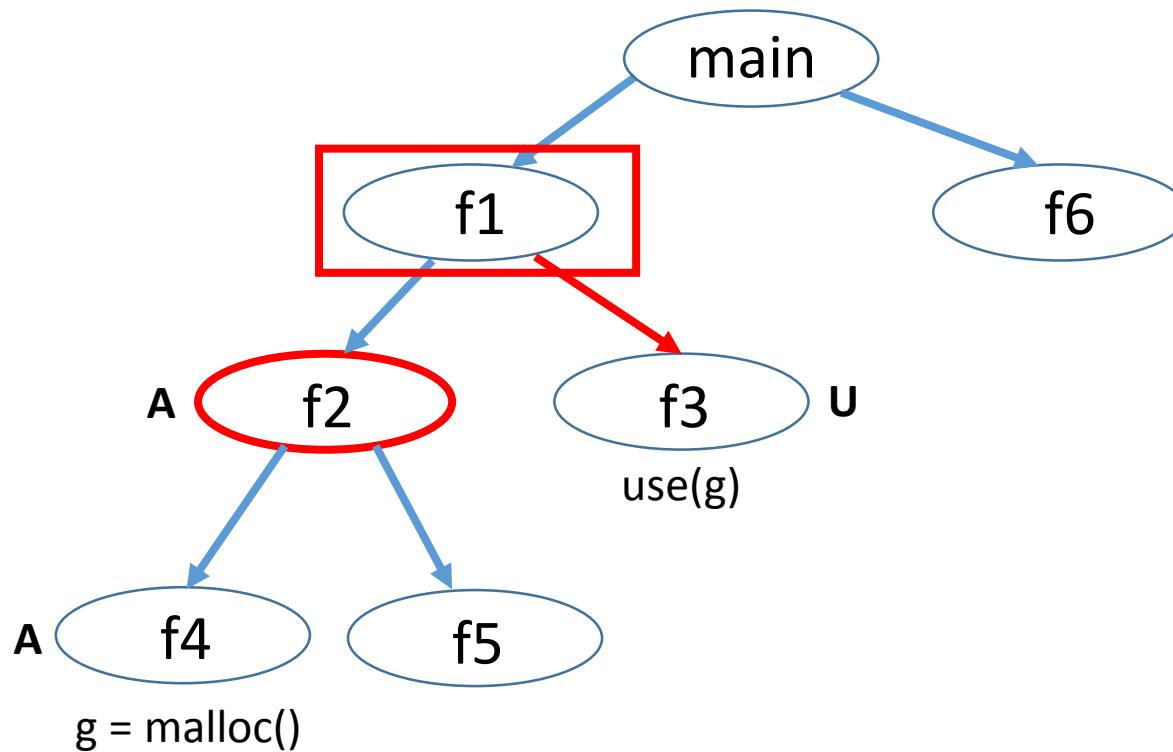
- Global variables escape from every function
- Solution: based on call graph





Global Variables

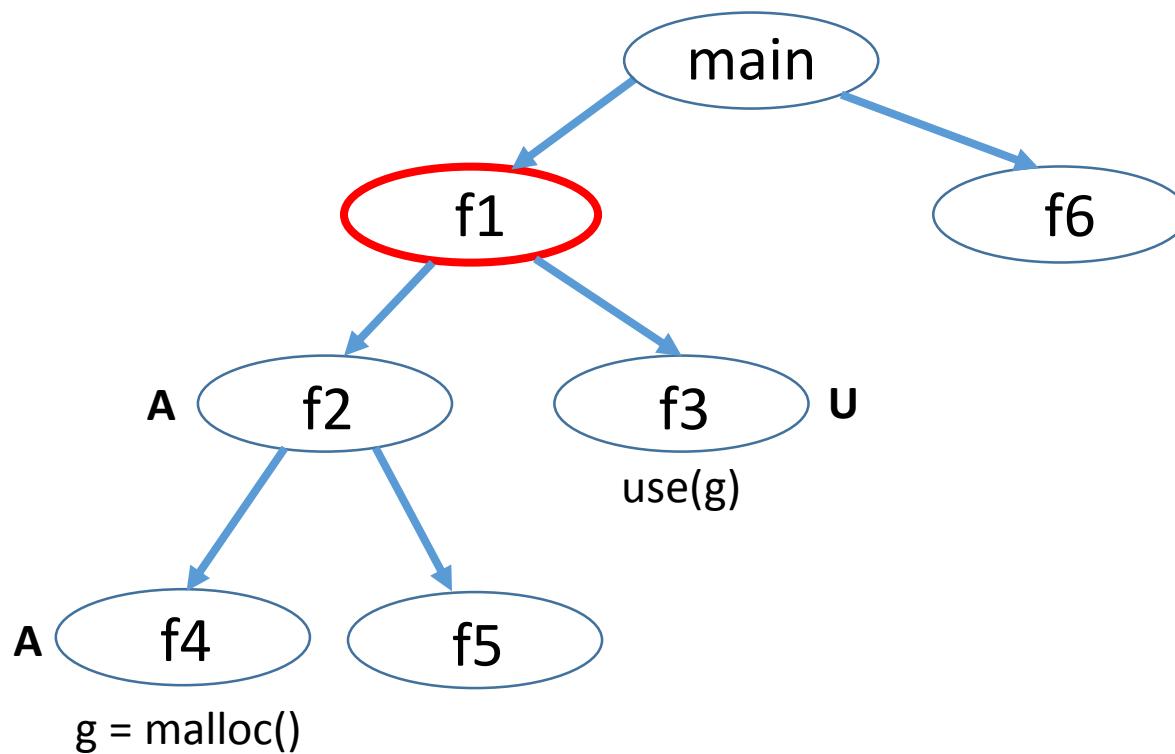
- Global variables escape from every function
- Solution: based on call graph





Global Variables

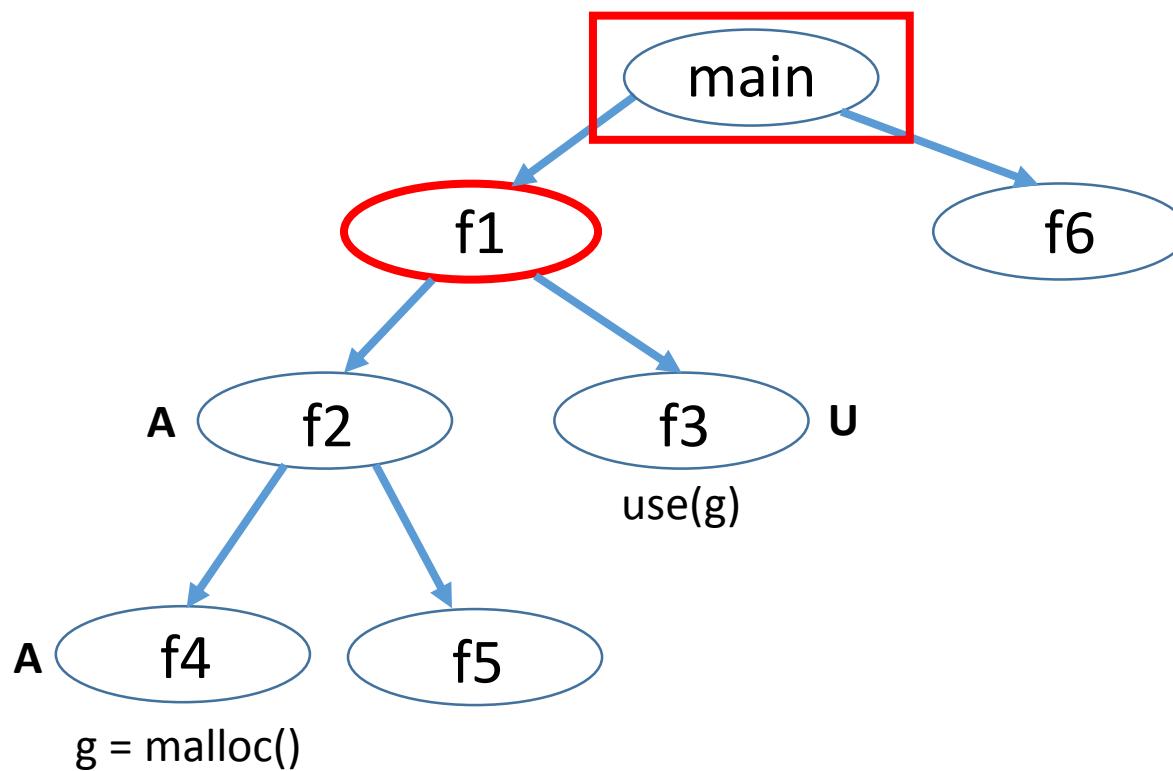
- Global variables escape from every function
- Solution: based on call graph





Global Variables

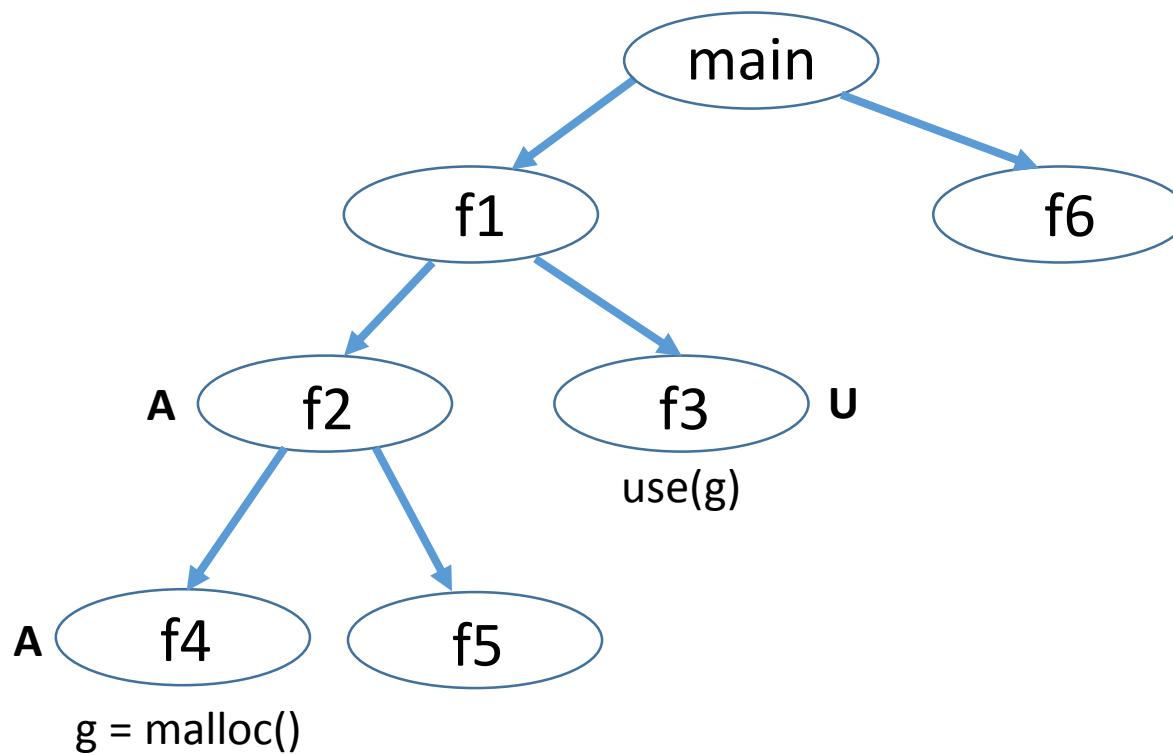
- Global variables escape from every function
- Solution: based on call graph





Global Variables

- Global variables escape from every function
- Solution: based on call graph





Implementation

- Implemented on LLVM
- Pointer analysis: DSA
- Open-source tool available
 - <http://sei.pku.edu.cn/~gaoqing11/leakfix>



Experimental results

- Benchmark: SPEC2000

Program	Size (Kloc)	#Func	#Allocation
art	1.3	44	11
quake	1.5	45	29
mcf	1.9	44	3
bzip2	4.6	92	10
gzip	7.8	128	5
parser	10.9	342	1
ammp	13.3	197	37
vpr	17.0	290	2
crafty	18.9	127	12
twolf	19.7	209	2
mesa	49.7	1124	67
vortex	52.7	941	8
perlbench	58.2	1094	4
gap	59.5	872	2
gcc	205.8	2271	53

Existing memory-leak detectors



Program	LC	Fastcheck	SPARROW	SABER
art	1(0)	1(0)	1(0)	1(0)
equake	0(0)	0(0)	0(0)	0(0)
mcf	0(0)	0(0)	0(0)	0(0)
bzip2	1(1)	0(0)	1(0)	1(0)
gzip	1(2)	0(0)	1(4)	1(0)
parser	0(0)	0(0)	0(0)	0(0)
ammp	20(4)	20(0)	20(0)	20(0)
vpr	0(0)	0(1)	0(9)	0(3)
crafty	0(0)	0(0)	0(0)	0(0)
twolf	0(0)	2(0)	5(0)	5(0)
mesa	2(0)	0(2)	9(0)	7(4)
vortex	0(26)	0(0)	0(1)	0(4)
perlbmk	1(0)	1(3)	N/A ¹	8(4)
gap	0(1)	0(0)	0(0)	0(0)
gcc	N/A ¹	35(2)	44(1)	40(5)
total	26(34)	59(8)	81(15)	83(20)



Fixing results

Program	#Fixed	#Maximum Detected	Percentage(%)	#Fixes	#Useless Fixes
art	0	1	0	0	0
equake	0	0	N/A	0	0
mcf	0	0	N/A	0	0
bzip2	1	1	100	1	0
gzip	1	1	100	1	0
parser	0	0	N/A	0	0
ammp	20	20	100	36	0
vpr	0	0	N/A	0	0
crafty	0	0	N/A	0	0
twolf	0	5	0	0	0
mesa	0	9	0	0	0
vortex	0	0	N/A	0	0
perlrbmk	1	8	13	1	0
gap	0	0	N/A	0	0
gcc	2	44	5	2	0
total	25	89	28	41	0



Time consumption

Program	Compiling and Linking (sec)	LeakFix (sec)		Total (sec)	Percentage(%)
		Pointer Analysis	Fix Analysis		
art	0.20	0.02	0.01	0.23	13.0
quake	0.21	0.01	0.02	0.24	12.5
mcf	1.19	0.02	0.01	1.22	2.5
bzip2	0.36	0.03	0.02	0.41	12.2
gzip	1.31	0.04	0.04	1.39	5.8
parser	1.68	0.18	0.07	1.93	13.0
ammp	2.98	0.12	0.37	3.47	14.1
vpr	2.51	0.20	0.31	3.02	16.9
crafty	3.53	0.16	0.23	3.92	9.9
twolf	6.22	0.27	0.20	6.69	7.0
mesa	9.36	5.36	5.97	20.69	54.8
vortex	9.00	0.94	0.83	10.77	16.4
perlrbmk	9.50	18.20	39.20	66.90	85.8
gap	6.03	7.36	22.36	35.75	83.1
gcc	10.99	31.76	95.81	142.99	89.2



Leaks failed to fix

- Flow-insensitive pointer analysis

```
void f(bool b){  
    int p=(int*)malloc(sizeof(int));  
    if (b){  
        free(p);  
    }  
    else{  
        *p=1;  
    }  
    int a;  
    p=&a;  
}
```



Leaks failed to fix

- Leak pattern in gcc

```
void f(bool b){  
    char *p= "";  
    if (b){  
        p=(char*)malloc(sizeof(char)*10);  
    }  
    use(p);  
}
```



Summary

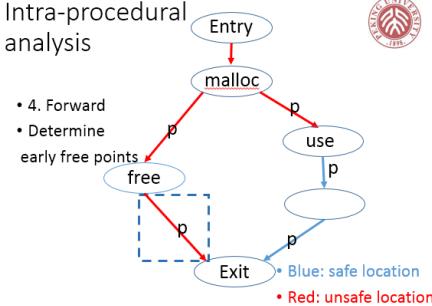
A safe fix

- The fix is after an allocation
- There is no double free
- There is no use after free
- There is an expression that always points to the allocation

Safe fix definition



Intra-procedural analysis

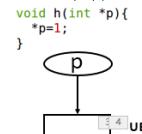


Intra-procedure analysis

Building summaries

- Function type for each memory chunk
- Allocation (A)
- Free (F)
- Use (U)
- Escape (E)

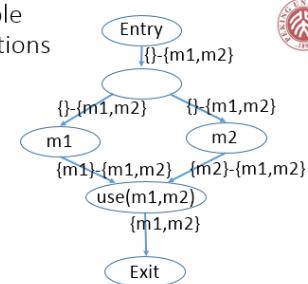
```
void h(int *p){  
    *p=1;  
}
```



```
void g(int *p){  
    free(p);  
}
```



Multiple Allocations



Multiple allocation

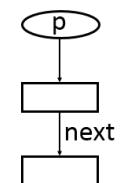
Loops



Heap Structure

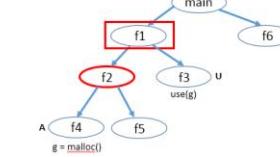
- Find references for heap structure
- Solution: based on points-to graph

```
void f(bool b){  
    for (int i = 0; i < 10; ++i){  
        int p=(int*)malloc(sizeof(int));  
        if (b){  
            free(p);  
        }  
        else{  
            p=(int*)malloc(sizeof(int)*2);  
        }  
    }  
}  
  
• Extract the loop
```



Loop

Global Variables



Heap structure

Fixing results



Program	#Fixed	#Maximum Detected	Percentaged(%)	#Fixes	#Useless Fixes
art	0	1	0	0	0
cyclic	0	0	N/A	0	0
inf	0	0	N/A	0	0
bzip2	1	1	100	1	0
gzip	1	1	100	1	0
parser	0	20	N/A	0	0
unzip	20	20	100	36	0
vpr	0	0	N/A	0	0
crafty	0	0	N/A	0	0
twolf	0	5	0	0	0
mesa	0	9	0	0	0
vortex	0	0	N/A	0	0
perfmark	1	8	11	1	0
gap	0	0	N/A	0	0
gcc	2	44	5	2	0
total	25	89	28	41	0

Global variable

Evaluation



Thank you !