

# Higher order functions and SQL

TEAM INFDEV

Hogeschool Rotterdam  
Rotterdam, Netherlands

Higher order  
functions and  
SQL

TEAM  
INFDEV

Introduction

Higher order  
function

List HOF's

SQL vs list  
HOF's

Conclusion

Assignments  
in class and  
during the  
practicum

# Introduction

## Motivation

- Sometimes simple functions are not flexible enough
- We might have similar algorithms that are “not quite” the same
- For example, consider adding or multiplying all elements of a list together
  - **“Consider” here actually means do it on paper and then a volunteer comes implement it at the lecturer’s PC**

Higher order  
functions and  
SQL

TEAM  
INFDEV

Introduction

Higher order  
function

List HOF's

SQL vs list  
HOF's

Conclusion

Assignments  
in class and  
during the  
practicum

# Higher order function

## Idea

- Functions may also take and return other functions as parameters
  - These are then called **higher order functions** (HOF's)<sup>a</sup>
- This lets us specify a function where some instructions are not fixed
- By passing other functions as parameters we literally create “customizable algorithms”

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<sup>a</sup>

# Higher order function

Higher order  
functions and  
SQL

TEAM  
INFDEV

Introduction

Higher order  
function

List HOF's

SQL vs list  
HOF's

Conclusion

Assignments  
in class and  
during the  
practicum

## Idea

- Functions may also take and return other functions as parameters
  - These are then called **higher order functions** (HOF's)<sup>a</sup>
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<sup>a</sup>**Higher order** because parameters are not concrete values but rather computations, which are higher wrt the floors of the Ivory Tower

## Example

- As an example, consider the case of combining two values together
- We do not care how, as long as they are combined according to some criterion
- The criterion is given as an input function

1  
2

```
def combine(op,x,y):  
    return op(x,y)
```

## Example

- What do we know about x and y?
- Do we even care?



Higher order  
functions and  
SQL

TEAM  
INFDEV

Introduction

Higher order  
function

List HOF's

SQL vs list  
HOF's

Conclusion

Assignments  
in class and  
during the  
practicum

## Example

- A function such as `combine` can be used by providing another function as the first parameter
- As long as the function will work correctly on the second and third parameters

```
1 def combine(op,x,y):  
2     return op(x,y)  
3  
4 def plus(x,y): return x + y  
5 def times(x,y): return x * y  
6 def minus(x,y): return x - y  
7  
8 print(combine(plus, 10, 20))  
9 print(combine(times, 10, 20))  
10 print(combine(minus, 10, 20))
```

## Example

- What does this code do?

```
1 def combine(op,x,y):  
2     return op(x,y)  
3  
4 def plus(x,y): return x + y  
5 def times(x,y): return x * y  
6 def minus(x,y): return x - y  
7  
8 print(combine(plus, 10, 20))  
9 print(combine(times, 10, 20))  
10 print(combine(minus, 10, 20))
```

## Example

- What does this code do?
- Prints 30, 200, -10

# Higher order function

Higher order  
functions and  
SQL

TEAM  
INFDEV

Introduction

Higher order  
function

List HOF's

SQL vs list  
HOF's

Conclusion

Assignments  
in class and  
during the  
practicum

## Example

- We can use `combine` on any data types we want
- For example, strings

```
1 def combine(op,x,y):  
2     return op(x,y)  
3  
4 def plus(x,y): return x + y  
5 def times(x,y): return x * y  
6 def minus(x,y): return x - y  
7  
8 print(combine(plus, "10", "20"))  
9 print(combine(times, 10, 20))  
10 print(combine(minus, 10, 20))
```

## Example

- What does this code do?

```
1 def combine(op,x,y):
2     return op(x,y)
3
4 def plus(x,y): return x + y
5 def times(x,y): return x * y
6 def minus(x,y): return x - y
7
8 print(combine(plus, "10", "20"))
9 print(combine(times, 10, 20))
10 print(combine(minus, 10, 20))
```

## Example

- What does this code do?
- Prints 1020, 200, -10

```
1 def combine(op,x,y):  
2     return op(x,y)  
3  
4 def plus(x,y): return x + y  
5 def times(x,y): return x * y  
6 def minus(x,y): return x - y  
7  
8 print(combine(plus, "10", "20"))  
9 print(combine(times, 10, 20))  
10 print(combine(minus, 10, 20))
```

**What do stack and heap look like from inside a call to combine?**

```

1 def combine(op,x,y):
2     return op(x,y)
3
4 def plus(x,y): return x + y
5 def times(x,y): return x * y
6 def minus(x,y): return x - y
7
8 print(combine(plus, "10", "20"))
9 print(combine(times, 10, 20))
10 print(combine(minus, 10, 20))

```

## What do stack and heap look like from inside a call to combine?

|   |    |         |    |           |      |      |
|---|----|---------|----|-----------|------|------|
| S | PC | combine | PC | op        | x    | y    |
|   | 8  | nil     | 2  | ref(plus) | "10" | "20" |

|   |  |
|---|--|
| H |  |
|   |  |

or

|   |    |         |    |            |    |    |
|---|----|---------|----|------------|----|----|
| S | PC | combine | PC | op         | x  | y  |
|   | 8  | nil     | 2  | ref(times) | 10 | 20 |

|   |  |
|---|--|
| H |  |
|   |  |



## Lambda-syntax function definition

- Defining functions such as plus, times, and minus is cumbersome
- After all, we already have symbols for them: (+), (\*), and (-)
- Repetition and duplication of code is never good

## Lambda-syntax function definition

- Python (version at least 3) offers facilities for the inline definition of short functions
- The syntax fits one line and requires no newlines
- `lambda <<parameters>>: <<result>>`
  - `<<parameters>>` is a list of comma-separated parameters
  - `<<result>>` is the expression that is returned
- For example: `lambda x,y: x+y`

```
1 def combine(op,x,y):  
2     return op(x,y)  
3  
4 print(combine((lambda x,y: x+y), "10", "20"))  
5 print(combine((lambda x,y: x*y), 10, 20))  
6 print(combine((lambda x,y: x-y), 10, 20))
```

## Lambda-syntax function definition

- What does this code do?

```
1 def combine(op,x,y):
2     return op(x,y)
3
4 print(combine((lambda x,y: x+y), "10", "20"))
5 print(combine((lambda x,y: x*y), 10, 20))
6 print(combine((lambda x,y: x-y), 10, 20))
```

## Lambda-syntax function definition

- **What does this code do?**
- Prints 1020, 200, -10
- Does not require the extra function definitions

```
1 def combine(op,x,y):  
2     return op(x,y)  
3  
4 print(combine((lambda x,y: x+y), "10", "20"))  
5 print(combine((lambda x,y: x*y), 10, 20))  
6 print(combine((lambda x,y: x-y), 10, 20))
```

**What do stack and heap look like from inside a call to combine?**

```

1 def combine(op,x,y):
2     return op(x,y)
3
4 print(combine((lambda x,y: x+y), "10", "20"))
5 print(combine((lambda x,y: x*y), 10, 20))
6 print(combine((lambda x,y: x-y), 10, 20))

```

## What do stack and heap look like from inside a call to combine?

|   |    |         |    |        |      |      |
|---|----|---------|----|--------|------|------|
| S | PC | combine | PC | op     | x    | y    |
|   | 4  | nil     | 2  | ref(0) | "10" | "20" |

|   |                 |
|---|-----------------|
| H | 0               |
|   | lambda x,y: x+y |

or

|   |    |         |    |        |    |    |
|---|----|---------|----|--------|----|----|
| S | PC | combine | PC | op     | x  | y  |
|   | 5  | nil     | 2  | ref(1) | 10 | 20 |

|   |                 |                 |
|---|-----------------|-----------------|
| H | 0               | 1               |
|   | lambda x,y: x+y | lambda x,y: x*y |

## Lambda-syntax function definition

- We can also return a function from a function
- For example, to dynamically choose an operation
- This makes code very expressive and flexible, but also potentially much harder to read
- Use with caution!

```
1 def combine(op,x,y):
2     return op(x,y)
3
4 def choose_operation():
5     i = input("Choose an operation between +, -, or *")
6     if i == "+":
7         return lambda x,y: x+y
8     elif i == "-":
9         return lambda x,y: x-y
10    else:
11        return lambda x,y: x*y
12    print(combine(choose_operation(), 10, 20))
```

## Lambda-syntax function definition

- What does this code do?



```
1 def combine(op,x,y):
2     return op(x,y)
3
4 def choose_operation():
5     i = input("Choose an operation between +, -, or *")
6     if i == "+":
7         return lambda x,y: x+y
8     elif i == "-":
9         return lambda x,y: x-y
10    else:
11        return lambda x,y: x*y
12    print(combine(choose_operation(), 10, 20))
```

## Lambda-syntax function definition

- What does this code do?
- Chooses the function based on input that will combine 10 and 20

```
1 def combine(op,x,y):
2     return op(x,y)
3
4 def choose_operation():
5     i = input("Choose an operation between +, -, or *")
6     if i == "+":
7         return lambda x,y: x+y
8     elif i == "-":
9         return lambda x,y: x-y
10    else:
11        return lambda x,y: x*y
12    print(combine(choose_operation(), 10, 20))
```

**What do stack and heap look like after choose\_operation terminates?**

```

1 def combine(op,x,y):
2     return op(x,y)
3
4 def choose_operation():
5     i = input("Choose an operation between +, -, or *")
6     if i == "+":
7         return lambda x,y: x+y
8     elif i == "-":
9         return lambda x,y: x-y
10    else:
11        return lambda x,y: x*y
12    print(combine(choose_operation(), 10, 20))

```

**What do stack and heap look like after choose\_operation terminates?**

|   |                 |                  |
|---|-----------------|------------------|
| S | PC              | choose_operation |
|   | 12              | ref(0)           |
| H | 0               |                  |
|   | lambda x,y: x+y |                  |

Higher order  
functions and  
SQL

TEAM  
INFDEV

Introduction

Higher order  
function

List HOF's

SQL vs list  
HOF's

Conclusion

Assignments  
in class and  
during the  
practicum

# List HOF's

Higher order  
functions and  
SQL

TEAM  
INFDEV

Introduction

Higher order  
function

List HOF's

SQL vs list  
HOF's

Conclusion

Assignments  
in class and  
during the  
practicum

## Introduction

- Consider our (now well-known) list implementation
- Empty and Node classes
- IsEmpty, Head, Tail methods

# List definition

Higher order  
functions and  
SQL

TEAM  
INFDEV

Introduction

Higher order  
function

List HOF's

SQL vs list  
HOF's

Conclusion

Assignments  
in class and  
during the  
practicum

```
1 class Empty:
2     def __init__(self):
3         self.IsEmpty = True
4     Empty = Empty()
5
6 class Node:
7     def __init__(self, x, xs):
8         self.IsEmpty = False
9         self.Head = x
10        self.Tail = xs
11
12 def printList(l):
13     if(l.IsEmpty):
14         return Empty
15     else:
16         print(l.Head)
17         printList(l.Tail)
```

Higher order  
functions and  
SQL

TEAM  
INFDEV

Introduction

Higher order  
function

List HOF's

SQL vs list  
HOF's

Conclusion

Assignments  
in class and  
during the  
practicum

## Fundamental operations on lists

- What are the **fundamental things** we wish to do with a list?

## Fundamental operations on lists

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- **Transform** all its elements:  $N \rightarrow N$



## Fundamental operations on lists

- What are the **fundamental things** we wish to do with a list?
- **Transform** all its elements:  $N \rightarrow N$
- **Filter** some of its elements:  $N \rightarrow M, M \leq N$

## Fundamental operations on lists

- What are the **fundamental things** we wish to do with a list?
- **Transform** all its elements:  $N \rightarrow N$
- **Filter** some of its elements:  $N \rightarrow M, M \leq N$
- **Fold** its elements into a single value:  $N \rightarrow 1$

# Transforming a list

Higher order  
functions and  
SQL

TEAM  
INFDEV

Introduction

Higher order  
function

List HOF's

SQL vs list  
HOF's

Conclusion

Assignments  
in class and  
during the  
practicum

```
1 def map(l, f):  
2     if(l.IsEmpty):  
3         return Empty  
4     else:  
5         return Node(f(l.Head), map(l.Tail, f))  
6  
7 printList(map(Node(1, Node(2, Node(3, Node(4, Empty)))), lambda x: x + 1))
```

## Fundamental operations on lists

- What does the code above print?

# Transforming a list

Higher order  
functions and  
SQL

TEAM  
INFDEV

Introduction

Higher order  
function

List HOF's

SQL vs list  
HOF's

Conclusion

Assignments  
in class and  
during the  
practicum

```
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7 printList(map(Node(1, Node(2, Node(3, Node(4, Empty)))), lambda x: x + 1))
```

## Fundamental operations on lists

- What does the code above print?
- 2, 3, 4, 5

# Transforming a list

Higher order  
functions and  
SQL

TEAM  
INFDEV

Introduction

Higher order  
function

List HOF's

SQL vs list  
HOF's

Conclusion

Assignments  
in class and  
during the  
practicum

```
1 def map(l, f):  
2     if(l.IsEmpty):  
3         return Empty  
4     else:  
5         return Node(f(l.Head), map(l.Tail, f))  
6  
7 printList(map(Node(1, Node(2, Node(3, Node(4, Empty)))), lambda x: x * 2))
```

## Fundamental operations on lists

- What does the code above print?

# Transforming a list

Higher order  
functions and  
SQL

TEAM  
INFDEV

Introduction

Higher order  
function

List HOF's

SQL vs list  
HOF's

Conclusion

Assignments  
in class and  
during the  
practicum

```
1 def map(l, f):  
2     if(l.IsEmpty):  
3         return Empty  
4     else:  
5         return Node(f(l.Head), map(l.Tail, f))  
6  
7 printList(map(Node(1, Node(2, Node(3, Node(4, Empty)))), lambda x: x * 2))
```

## Fundamental operations on lists

- What does the code above print?
- 2, 4, 6, 8

# Filtering a list

Higher order  
functions and  
SQL

TEAM  
INFDEV

Introduction

Higher order  
function

List HOF's

SQL vs list  
HOF's

Conclusion

Assignments  
in class and  
during the  
practicum

```
1 def filter(l, p):
2     if(l.IsEmpty):
3         return Empty
4     else:
5         if p(l.Head):
6             return Node(l.Head, filter(l.Tail, p))
7         else:
8             return filter(l.Tail, p)
9
10 printList(filter(Node(1, Node(2, Node(3, Node(4, Empty)))), lambda x: x \% 2
    == 0))
```

## Fundamental operations on lists

- What does the code above print?

# Filtering a list

Higher order  
functions and  
SQL

TEAM  
INFDEV

Introduction

Higher order  
function

List HOF's

SQL vs list  
HOF's

Conclusion

Assignments  
in class and  
during the  
practicum

```
1 def filter(l, p):
2     if(l.IsEmpty):
3         return Empty
4     else:
5         if p(l.Head):
6             return Node(l.Head, filter(l.Tail, p))
7         else:
8             return filter(l.Tail, p)
9
10 printList(filter(Node(1, Node(2, Node(3, Node(4, Empty)))), lambda x: x \% 2
    == 0))
```

## Fundamental operations on lists

- What does the code above print?
- 2, 4



# Folding a list

Higher order  
functions and  
SQL

TEAM  
INFDEV

Introduction

Higher order  
function

List HOF's

SQL vs list  
HOF's

Conclusion

Assignments  
in class and  
during the  
practicum

```
1 def fold(l, f, z):
2     if(l.IsEmpty):
3         return z
4     else:
5         return f(l.Head, fold(l.Tail, f, z))
6
7 print(fold(Node(1, Node(2, Node(3, Node(4, Empty)))), lambda x, y: x + y, 0))
```

## Fundamental operations on lists

- What does the code above print?

# Folding a list

Higher order  
functions and  
SQL

TEAM  
INFDEV

Introduction

Higher order  
function

List HOF's

SQL vs list  
HOF's

Conclusion

Assignments  
in class and  
during the  
practicum

```
1 def fold(l, f, z):  
2     if(l.IsEmpty):  
3         return z  
4     else:  
5         return f(l.Head, fold(l.Tail, f, z))  
6  
7 print(fold(Node(1, Node(2, Node(3, Node(4, Empty)))), lambda x, y: x + y, 0)  
      )
```

## Fundamental operations on lists

- What does the code above print?
- 10

## Using HOF's

- We can perform almost anything we need to do no lists with `map`, `filter`, and `fold`
- Some complex algorithm cannot be implemented relying on unbounded recursion (where we cannot estimate the maximum number of steps)
- This happens because `map`, `filter`, and `fold` will always terminate (if the input function terminates)
- Still, they are quite powerful in their capabilities

## Using HOF's

- map is very obvious: transform elements
  - `map(cars, drive)`
  - `map(planes, fly)`
  - `map(bikes, pedal)`
  - ...

## Using HOF's

- `filter` is also very obvious: remove useless elements
  - `filter(cars, arrived)`
  - `filter(planes, landed)`
  - `filter(bikes, crashed)`
  - ...

## Using HOF's

- fold is much more complex
- Recall that it folds a list into a single value  $N \rightarrow 1$ 
  - `fold(1, lambda x,l: 1 + 1, 0) = ?`

## Using HOF's

- fold is much more complex
- Recall that it folds a list into a single value  $N \rightarrow 1$ 
  - `fold(1, lambda x,l: 1 + 1, 0) = ?` length of l
  - `fold(1, max, float('-inf')) = ?`

## Using HOF's

- fold is much more complex
- Recall that it folds a list into a single value  $N \rightarrow 1$ 
  - `fold(l, lambda x,l: l + 1, 0) = ?` length of l
  - `fold(l, max, float('-inf')) = ?` max of l
  - `fold(l, min, float('inf')) = ?`



## Using HOF's

- fold is much more complex
- Recall that it folds a list into a single value  $N \rightarrow 1$ 
  - `fold(l, lambda x,l: l + 1, 0) = ?` length of l
  - `fold(l, max, float('-inf')) = ?` max of l
  - `fold(l, min, float('inf')) = ?` min of l
  - `fold(cars, closerToPlayer, None) = ?`

## Using HOF's

- fold is much more complex
- Recall that it folds a list into a single value  $N \rightarrow 1$ 
  - `fold(l, lambda x,l: l + 1, 0) = ?` length of l
  - `fold(l, max, float('-inf')) = ?` max of l
  - `fold(l, min, float('inf')) = ?` min of l
  - `fold(cars, closerToPlayer, None) = ?` closest car to player
  - ...

Higher order  
functions and  
SQL

TEAM  
INFDEV

Introduction

Higher order  
function

List HOF's

SQL vs list  
HOF's

Conclusion

Assignments  
in class and  
during the  
practicum

## Folding to lists

- fold can return a value of an arbitrary type
- **Also a list?**

Higher order  
functions and  
SQL

TEAM  
INFDEV

Introduction

Higher order  
function

List HOF's

SQL vs list  
HOF's

Conclusion

Assignments  
in class and  
during the  
practicum

## Folding to lists

- fold can return a value of an arbitrary type
- **Also a list?** Yes!

# Folding to lists

Higher order  
functions and  
SQL

TEAM  
INFDEV

Introduction

Higher order  
function

List HOF's

SQL vs list  
HOF's

Conclusion

Assignments  
in class and  
during the  
practicum

```
1 printList(  
2     fold(  
3         Node(1, Node(2, Node(3, Node(4, Empty)))),  
4         lambda x, y: Node(x+1,y),  
5         Empty))
```

## Folding to lists

- What does the code above print?

# Folding to lists

Higher order  
functions and  
SQL

TEAM  
INFDEV

Introduction

Higher order  
function

List HOF's

SQL vs list  
HOF's

Conclusion

Assignments  
in class and  
during the  
practicum

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1 printList(  
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3         Node(1, Node(2, Node(3, Node(4, Empty)))),  
4         lambda x, y: Node(x+1,y),  
5         Empty))
```

## Folding to lists

- What does the code above print?
- 2, 3, 4, 5
- What does it look like?

# Folding to lists

Higher order  
functions and  
SQL

TEAM  
INFDEV

Introduction

Higher order  
function

List HOF's

SQL vs list  
HOF's

Conclusion

Assignments  
in class and  
during the  
practicum

```
1 printList(  
2     fold(  
3         Node(1, Node(2, Node(3, Node(4, Empty)))),  
4         lambda x, y: Node(x+1,y),  
5         Empty))
```

## Folding to lists

- What does the code above print?
- 2, 3, 4, 5
- What does it look like?
- **A map!**

## Combine list HOF's

- We can clearly combine map, filter, and fold
- For example, we could say `filter(map(l, f), p)` that applies a map first and a filter second
  - `filter(map(cars, drive), arrived) = ?`



## Combine list HOF's

- We can clearly combine map, filter, and fold
- For example, we could say `filter(map(l, f), p)` that applies a map first and a filter second
  - `filter(map(cars, drive), arrived) = ?` updated cars that have not yet arrived

Higher order  
functions and  
SQL

TEAM  
INFDEV

Introduction

Higher order  
function

List HOF's

SQL vs list  
HOF's

Conclusion

Assignments  
in class and  
during the  
practicum

# SQL vs list HOF's

Higher order  
functions and  
SQL

TEAM  
INFDEV

Introduction

Higher order  
function

List HOF's

SQL vs list  
HOF's

Conclusion

Assignments  
in class and  
during the  
practicum

## Introduction



Higher order  
functions and  
SQL

TEAM  
INFDEV

Introduction

Higher order  
function

List HOF's

SQL vs list  
HOF's

Conclusion

Assignments  
in class and  
during the  
practicum

# Conclusion

## Lecture topics

- Often, user code needs to perform operations that are similar to each other
- Through the mechanism of function definition, we can recycle code
- Functions can encode algorithms in many way
  - Simple code abstractions to avoid repetition
  - Recursive problems
  - Algorithms with “holes” given as higher order parameters
  - Algorithms that return other algorithms as higher order results

Higher order  
functions and  
SQL

TEAM  
INFDEV

Introduction

Higher order  
function

List HOF's

SQL vs list  
HOF's

Conclusion

Assignments  
in class and  
during the  
practicum

# Assignments in class and during the practicum

Higher order  
functions and  
SQL

TEAM  
INFDEV

Introduction

Higher order  
function

List HOF's

SQL vs list  
HOF's

Conclusion

Assignments  
in class and  
during the  
practicum

## Build and test, on paper and then in Python

- A Car class, with a drive function that returns the car at a new position
- A driveAllCars function that drives all cars in a list through use of map
- A removeArrived function that removes all cars from the list that reached their destination

Higher order  
functions and  
SQL

TEAM  
INFDEV

Introduction

Higher order  
function

List HOF's

SQL vs list  
HOF's

Conclusion

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during the  
practicum

The best of luck, and thanks for the  
attention!