

Exercise 21: Loose Change

Andreas Loibl

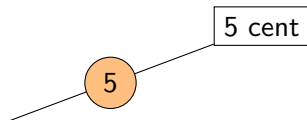
November 10, 2010

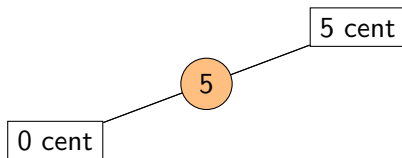
Inhaltsverzeichnis

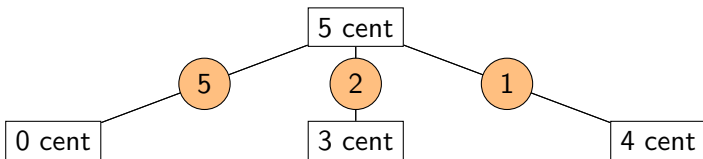
- 1 Algorithm
 - Example tree
 - Implementation
- 2 Answer
- 3 Performance
 - Step 1 & 2
 - Step 3: Caching

Algorithm

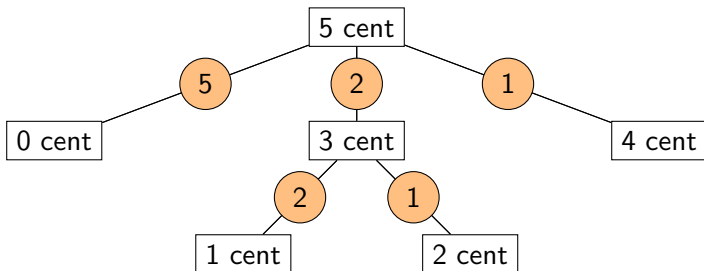
5 cent

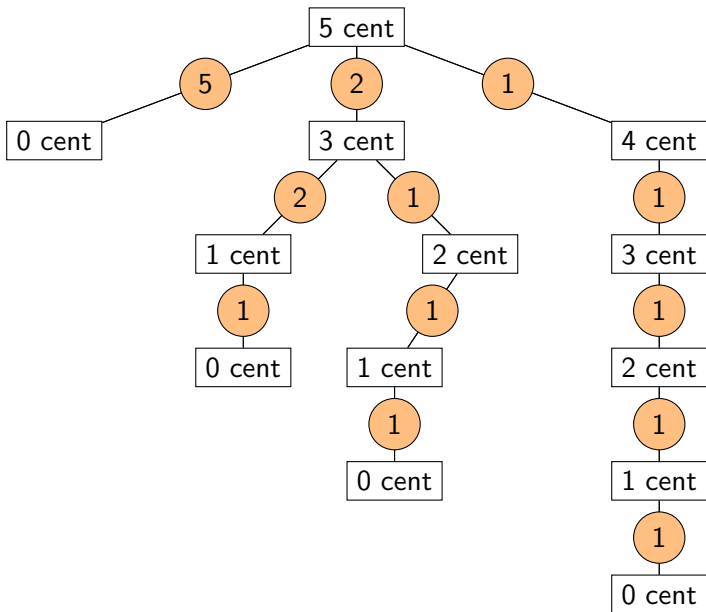






Example tree





in Pseudocode

```
function SPLITMONEY(cents, lastcoin, path)  
  if cents = 0 then                                     ▷ termination condition  
    output path  
  else  
    for coin ∈ {200, 100, 50, 20, 10, 5, 2, 1} do  
      if cents ≥ coin ∧ lastcoin ≥ coin then  
        newpath ← path  
        append coin to newpath  
        newcents ← cents − coin  
        SPLITMONEY(newcents, coin, newpath) ▷ recursion  
      end if  
    end for  
  end if  
end function
```

in Pseudocode

```
function SPLITMONEY(cents, lastcoin, path)  
  if cents = 0 then                                     ▷ termination condition  
    output path  
  else  
    for coin ∈ {200, 100, 50, 20, 10, 5, 2, 1} do  
      if cents ≥ coin ∧ lastcoin ≥ coin then  
        newpath ← path  
        append coin to newpath  
        newcents ← cents − coin  
        SPLITMONEY(newcents, coin, newpath) ▷ recursion  
      end if  
    end for  
  end if  
end function
```

in Pseudocode

```
function SPLITMONEY(cents, lastcoin, path)  
  if cents = 0 then                                     ▷ termination condition  
    output path  
  else  
    for coin ∈ {200, 100, 50, 20, 10, 5, 2, 1} do  
      if cents ≥ coin ∧ lastcoin ≥ coin then  
        newpath ← path  
        append coin to newpath  
        newcents ← cents − coin  
        SPLITMONEY(newcents, coin, newpath) ▷ recursion  
      end if  
    end for  
  end if  
end function
```

in Pseudocode

```
function SPLITMONEY(cents, lastcoin, path)  
  if cents = 0 then                                     ▷ termination condition  
    output path  
  else  
    for coin ∈ {200, 100, 50, 20, 10, 5, 2, 1} do  
      if cents ≥ coin ∧ lastcoin ≥ coin then  
        newpath ← path  
        append coin to newpath  
        newcents ← cents − coin  
        SPLITMONEY(newcents, coin, newpath) ▷ recursion  
      end if  
    end for  
  end if  
end function
```

in Pseudocode

```

function SPLITMONEY(cents, lastcoin, path)
  if cents = 0 then                                     ▷ termination condition
    output path
  else
    for coin ∈ {200, 100, 50, 20, 10, 5, 2, 1} do
      if cents ≥ coin ∧ lastcoin ≥ coin then
        newpath ← path
        append coin to newpath
        newcents ← cents − coin
        SPLITMONEY(newcents, coin, newpath) ▷ recursion
      end if
    end for
  end if
end function

```

in Pseudocode

```
function SPLITMONEY(cents, lastcoin, path)  
  if cents = 0 then                                     ▷ termination condition  
    output path  
  else  
    for coin ∈ {200, 100, 50, 20, 10, 5, 2, 1} do  
      if cents ≥ coin ∧ lastcoin ≥ coin then  
        newpath ← path  
        append coin to newpath  
        newcents ← cents − coin  
        SPLITMONEY(newcents, coin, newpath) ▷ recursion  
      end if  
    end for  
  end if  
end function
```


in R code

```
split_money <- function(cents, lastcoin=cents, path=
  NULL)
{
  if(cents == 0)
    print(path)
  else
    for(coin in c(200, 100, 50, 20, 10, 5, 2, 1))
    {
      if(cents >= coin && lastcoin >= coin)
      {
        split_money(cents-coin, coin, c(path, coin))
      }
    }
}
}
```

in R code (returning a list)

```
split_money <- function(cents, lastcoin=cents, path=
  NULL)
{
  res <- list(NULL); res[[1]] <- NULL
  if(cents == 0)
    return(list(path))

  for(coin in c(200, 100, 50, 20, 10, 5, 2, 1))
  {
    if(cents >= coin && lastcoin >= coin)
    {
      for(sequence in split_money(cents-coin, coin,
        c(path, coin)))
        res[[length(res)+1]] <- sequence
    }
  }
  return(res)
}
```

format list more human readable (collapsed)

```

format_output <- function(data)
{
  res <- list(NULL); res[[1]] <- NULL
  for(coins in data)
  {
    output <- character()
    coins.rle <- rle(coins)
    coins.data <- data.frame(coin = coins.rle$values, count = coins.rle$lengths)
    for(i in 1:length(coins.data$count))
      output <- c(output, paste(c(coins.data$coin[i], coins.data$count[i]),
                                collapse=" cent x "))
    res[[length(res)+1]] <- output
  }
  return(res)
}

```

output example

"5 cent x 3" "2 cent x 2" "1 cent x 1" instead of "5 5 5 2 2 1"

Answer

Question

How many different ways can €2.50 be made using any number of coins?

```
> source("ex21_loose_change.R")  
> a <- split_money(250)  
> length(a)  
[1] 200187
```

Answer

There are **200187** different ways €2.50 can be made of coins.

Performance

- So you see that this algorithm works, but you should have a look at the performance
- If you try to compute the number this way you will notice how slow it is and how long it takes to finish
- On this machine¹ it took almost **12 minutes**
- This bad performance is caused by the recursion which calls itself very often (exponentially!)
- In order to speed up the calculation I rewrote the algorithm:
 - Step 1: only calculate the number of possible ways, do not create a list of them
 - Step 2: replace for-loop with R's apply-function
 - Step 3: add a cache for the calculated values (very important!)

¹ThinkPad X200 with Intel Core2 Duo P8600

- So you see that this algorithm works, but you should have a look at the performance
- If you try to compute the number this way you will notice how slow it is and how long it takes to finish
- On this machine¹ it took almost **12 minutes**
- This bad performance is caused by the recursion which calls itself very often (exponentially!)
- In order to speed up the calculation I rewrote the algorithm:
 - Step 1: only calculate the number of possible ways, do not create a list of them
 - Step 2: replace for-loop with R's apply-function
 - Step 3: add a cache for the calculated values (very important!)

¹ThinkPad X200 with Intel Core2 Duo P8600

- So you see that this algorithm works, but you should have a look at the performance
- If you try to compute the number this way you will notice how slow it is and how long it takes to finish
- On this machine¹ it took almost **12 minutes**
- This bad performance is caused by the recursion which calls itself very often (exponentially!)
- In order to speed up the calculation I rewrote the algorithm:
 - Step 1: only calculate the number of possible ways, do not create a list of them
 - Step 2: replace for-loop with R's apply-function
 - Step 3: add a cache for the calculated values (very important!)

¹ThinkPad X200 with Intel Core2 Duo P8600

- So you see that this algorithm works, but you should have a look at the performance
- If you try to compute the number this way you will notice how slow it is and how long it takes to finish
- On this machine¹ it took almost **12 minutes**
- This bad performance is caused by the recursion which calls itself very often (exponentially!)
- In order to speed up the calculation I rewrote the algorithm:
 - Step 1: only calculate the number of possible ways, do not create a list of them
 - Step 2: replace for-loop with R's apply-function
 - Step 3: add a cache for the calculated values (very important!)

¹ThinkPad X200 with Intel Core2 Duo P8600

- So you see that this algorithm works, but you should have a look at the performance
- If you try to compute the number this way you will notice how slow it is and how long it takes to finish
- On this machine¹ it took almost **12 minutes**
- This bad performance is caused by the recursion which calls itself very often (exponentially!)
- In order to speed up the calculation I rewrote the algorithm:
 - Step 1: only calculate the number of possible ways, do not create a list of them
 - Step 2: replace for-loop with R's apply-function
 - Step 3: add a cache for the calculated values (very important!)

¹ThinkPad X200 with Intel Core2 Duo P8600

```
coins.available <- c(200, 100, 50, 20, 10, 5, 2, 1)

ways_to_split_money <- function(cents, lastcoin=0)
{
  if(!lastcoin)
  {
    lastcoin <- cents
  }
  if(cents < 2) return(1)
  coins <- coins.available
  coins <- coins[which(cents>=coins)]
  coins <- coins[which(lastcoin>=coins)]
  return(sum(sapply(coins, function(coin) ways_to_split_money(cents-coin, coin))
  ))
}
```

Step 3: Caching

```

coins.available <- c(200, 100, 50, 20, 10, 5, 2, 1)

ways_to_split_money <- function(cents, lastcoin=0)
{
  if(!lastcoin)
  {
    cache <-< matrix(0, cents, length(coins.available))
    lastcoin <- cents
  }
  use_cache <- function(cents, lastcoin, value=0)
  {
    if(! lastcoin || ! lastcoin %in% coins.available) return(value)
    if(value) cache[cents, which(coins.available==lastcoin)] <-< value
    return(cache[cents, which(coins.available==lastcoin)])
  }
  if(cents < 2) return(1)
  if(use_cache(cents, lastcoin)>0) return(use_cache(cents, lastcoin))
  coins <- coins.available
  coins <- coins[which(cents>=coins)]
  coins <- coins[which(lastcoin>=coins)]
  return(
    use_cache(cents, lastcoin,
      sum(sapply(coins, function(coin) ways_to_split_money(cents-coin, coin)))
    ))
}

```

Step 3: Caching

```

> cache
  [,1] [,2] [,3] [,4] [,5] [,6] [,7] [,8]
[1,]  0    0    0    0    0    0    0    0
[2,]  0    0    0    0    0    0    2    1
[3,]  0    0    0    0    0    0    2    1
[4,]  0    0    0    0    0    0    3    1
[5,]  0    0    0    0    0    4    3    1
[6,]  0    0    0    0    0    0    4    1
[7,]  0    0    0    0    0    0    4    1
[8,]  0    0    0    0    0    0    5    1
[9,]  0    0    0    0    0    0    5    1
[10,] 0    0    0    11   11   10    6    1
[11,] 0    0    0    0    0    0    6    1
[12,] 0    0    0    0    0    0    7    1
[13,] 0    0    0    0    0    0    7    1
[14,] 0    0    0    0    0    0    8    1
[15,] 0    0    0    0    0    18   8    1
[16,] 0    0    0    0    0    0    9    1
[17,] 0    0    0    0    0    0    9    1
[18,] 0    0    0    0    0    0   10   1
[19,] 0    0    0    0    0    0   10   1
[20,] 0    0    0    41   40   29   11   1
(...)
[50,] 451   451   451   450   341  146   26   1
(...)
[250,] 0    0    0    0    0    0    0    0

```

Step 3: Caching

```
$ time ./ex21_loose_change.R 250 # 2.50 EUR in coins  
[1] 200187  
real    0m0.269s  
$ time ./ex21_loose_change.R 1000 # 10 EUR in coins  
[1] 321335886  
real    0m0.598s  
$ time ./ex21_loose_change.R 10000 # 100 EUR in coins  
[1] 1.133873e+15  
real    0m4.538s  
$ time ./ex21_loose_change.R 50000 # 500 EUR in coins  
[1] 7.963173e+19  
real    0m22.145s
```

Result

Huge speed improvement by implementing the cache