

# Resource Analysis: Problem Set 2

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## 2.1 (16 Points) Analysis of Insertion Sort

Insertion sort for lists of lists can be implemented in OCaml as follows.

```
let rec compare_list l1 l2 =
  match l1 with
  | [] → true
  | x::xs →
    match l2 with
    | [] → false
    | y::ys →
      if x = y then
        compare_list xs ys
      else
        x < y

let rec insert le x l =
  match l with
  | [] → [x]
  | y::ys →
    if le y x then y::insert le x ys
    else x::y::ys

let rec isort le l =
  match l with
  | [] → []
  | x::xs → insert le x (isort le xs)

let isort_list = isort compare_list
```

The function *isort\_list* sorts lists in lexicographical order. Use recurrence relations to derive an asymptotic worst-case bound for *isort\_list* in the same way we derived a bound for quick sort in the lecture.

- Define a system of recurrence relation so that there is one recurrence relation for *isort\_list* and for every function that can be called by *isort\_list*.
- Solve the system of recurrence relations in a bottom-up manner.

**Remarks:**

*Cost model:* Derive a bound on the *number of function calls* that are performed by a functions. Constructor calls such as `::` do not count as function calls.

*Higher-order functions:* It is up to you how to treat higher-order functions. One possibility is to use higher-order recurrence relations like  $T(n, f) = f(n)$ . Another possibility is to simply model first-order functions such as *insert compare\_list* only.

*Polymorphism:* In OCaml, *isort\_list* has the type `'a list list → 'a list list`. Assume for the analysis the type `int list list → int list list`. In particular, you can account constant time for the operations `<` and `=` in the function *insert*.

**2.2 (8 Points) Amortized Analysis I (Potential Method)**

Consider a sequence of operations  $f_1, \dots, f_n$  in which the cost of the  $i$ th operation is defined by

$$\text{cost}(f_i) = \begin{cases} i & \text{if } i = 2^k \text{ for some } k \\ 1 & \text{otherwise} \end{cases}$$

Use the potential method to determine the amortized cost per operation.

**2.3 (12 Points) Amortized Analysis II (Functional Queue)**

A simple and elegant way of implementing a queue in a functional programming language is to use two lists.

```

type 'a queue = Queue of 'a list * 'a list

let empty = Queue ([], [])

let enqueue (Queue (inq, outq)) x =
  Queue (x::inq, outq)

let rec rev_append l1 l2 =
  match l1 with
  | [] → l2
  | x::xs → rev_append xs (x::l2)

let rev l = rev_append l []

let rec dequeue (Queue (inq, outq)) =
  match outq, inq with
  | [], [] → raise Queue_empty
  | [], _ → dequeue (Queue ([], rev inq))
  | y::ys, _ → (Queue (inq, ys), y)

```

- Briefly describe the idea of the *queue* data structure.
- How many *cons* operations (uses of `::`) are performed by *dequeue* in the worst-case?
- Consider a sequence of  $n$  *enqueue* or *dequeue* operations of the form

```
let b1 in
let b2 in
...
let bk in
()
```

where

$b_i \equiv q = \text{enqueue } q \ n$  for an integer  $n$  or  $b_i \equiv (q, \_) = \text{dequeue } q$

Use the potential method to determine the amortized number of *cons* operations that is performed per operation. (Clearly define the potential function that you are using.)

d) Consider the following OCaml expression.

```
let q = Queue ([3;2;1], []) in
let (_,_) = dequeue q in
let (_,_) = dequeue q
```

How many *cons* operation are performed if the above code is evaluated? What program property is necessary to make the analysis you performed in Part (c) applicable?