Constant-space Quicksort

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Introduction

It is a pleasure to write a paper that deals with algorithm Quicksort, which was invented by Tony Hoare, and that presents a version of Quicksort in terms of its correctness proof, a method of presentation that owes its existence to fundamental work by Tony Hoare. This paper is a response to [1] and [2], which attempt to describe a constant-space Quicksort. In [1], Durian presents his algorithm in a traditional operational fashion. The inadequacy of this approach is exemplified by the fact that his algorithm IQS does not work correctly for arrays of size less than 10. In [2], Wegner does provide some form of proof of correctness, but, as far as I could tell, the invariants he proposed were not invariants, and I had great difficulty understanding his algorithm.

Based on what I gleaned from [1] and [2], I developed my own version of constant-space Quicksort. The presentation given below is in two parts. First, I present a Quicksort algorithm in which variables explicitly contain the bounds of segments of the array still to be sorted. Second, I give a coordinate transformation to eliminate these variables, thus eliminating the extra space. This separates nicely the basic understanding of Quicksort from the change in data structures needed to force constant space. It also allowed me to see that a binary search could be used, and on a segment of the array that is not sorted!

Let me offer a frustration of mine. I can explain the idea behind constant-space *Quicksort* on a whiteboard in less than five minutes. However, to write a correct and understandable algorithm that incorporates that idea is not so easy, as the results of two earlier papers show. Unfortunately, ideas and their implementation in algorithms are two different things.

Experiments with constant-space Quicksort by Brandon Dixon found it to be about 5% slower than our best Quicksort on arrays of 1K to 100K elements. Since the best Quicksort requires only O(log.n) space to sort an n-element array, it remains the algorithm of choice in most instances.

In the interests of brevity and clarity, our algorithm is only for arrays with distinct elements; the extension to arrays with duplicates is left to the reader. Finally, we take extreme care with parts of the proof, giving many details, so that the reader not too well versed in presentation-by-correctness-proof can see what really is necessary in proving a program correct.

Quicksort as a preprocessor for Insertionsort

Integer array b[0..n-1], where $0 \le n$ and all elements are distinct, can be sorted by algorithm Insertionsort (which appears in most introductory texts) in expected and worst-case time $O(n^2)$. However, by suitably preprocessing b in expected time $O(n \cdot log.n)$, Insertionsort will take only linear time, so the total expected time will be $O(n \cdot log.n)$. This preprocessing is the subject of this paper.

An integer i is called a *pivot* of b if everything to the left of b.i is less than b.i and everything to the right is greater:

$$pivot.i = b[..i-1] < b.i < b[i+1..]$$
 (1.1)

We assume virtual elements $b.(-1) = -\infty$ and $b.n = \infty$, so that b has at least the pivots -1 and n. Suppose i and j are pivots satisfying $i < j \le i + H$ for some constant H > 1, so that

$$b[..i] < b[i+1..j-1] < b[j..] \quad .$$

Then, when sorting b, Insertionsort requires at most time O(H) to place one element of b[i+1..j-1] in its final position and time $O(H \cdot (j-i-1))$ to place them all. Also, all pivots are in their final position and require only constant-time processing. Hence, if successive pivots of b are at most H apart, Insertionsort requires at most time $O(H \cdot n)$ to sort b. Thus, we seek preprocessing that creates such successive pivots.

Linear-space preprocessing

We now present an algorithm for permuting b[0..n-1] so that its successive pivots are at most H apart. With B denoting the initial value of b, and remembering the two virtual elements b.(-1) and b.n, the precondition is

$$Q: 0 \le n \land b[-1..n] = B \land b. -1 = -\infty \land b.n = \infty \land (\forall i, j \mid -1 \le i < j \le n : b.i \ne b.j) .$$

In presenting the postcondition, we use the following notation and terminology on sequences. Juxtaposition denotes catenation of sequences and elements. When they are not explicitly typed, capital letters denote elements and small letters sequences. Function first.x yields the first element of sequence x and last.x its last, and function tail.x is defined by $x = first.x \ tail.x$. Finally, for sequences x and y we define

```
x \operatorname{seg} y = (\exists w, z \mid : w \ x \ z = y).
```

The postcondition of the preprocessing algorithm consists of the conjuncts R0, R1, R2, and R3, given below, which use two variables u and v of type seq(int) to contain sequences of pivots. Two variables are used instead of one to ease the later exposition.

R0 states that b is a permutation of its initial value. R1 states that sequence u v is in strictly ascending order ($increasing(u \ v)$) and defines the first element of u and last element of v as the virtual pivots of v indicates that all elements of v are pivots. Finally, v indicates that successive elements of v are at most v apart.

```
\begin{array}{ll} R0: \ perm(b,B) \\ R1: \ increasing(u\ v) \ \land \ first.u = -1 \ \land \ last.v = n \\ R2: \ (\forall I \mid I \in (u\ v): pivot.I) \\ R3: \ (\forall I, J \mid (I\ J) \ \mathbf{seg}\ (u\ v): J - I \leq H) \end{array}
```

Algorithm (1.2) below truthifies this postcondition.

```
u, v := \langle -1 \rangle, \langle n \rangle; \tag{1.2} {Invariant: R0 \land R1 \land R2 \land P3 (see below)} \mathbf{do} \ \mathit{first.} v - \mathit{last.} u > H \rightarrow \mathbf{var} \ k : \mathit{int}; Partition(b, \mathit{last.} u + 1, \mathit{first.} v - 1, k); \{R0 \land R1 \land R2 \land P3 \land P4 \ (\text{see below})\} v := k \ v [] \mathit{first.} v - \mathit{last.} u \leq H \land \mathit{first.} v \neq n \rightarrow u, v := u \ \mathit{first.} v, \mathit{tail.} v od
```

The invariant is similar to postcondition R, except that R3 has been weakened to P3, which says that successive pivots in u (and not uv) are at most H apart).

$$P3: (\forall I, J \mid (I J) \text{ seg } u: J - I \le H) \tag{1.3}$$

$$P4: last.u < k < first.v \land b[..k-1] < b.k < b[k+1..]$$
 (1.4)

Statement Partition(...) of the algorithm is the standard partition algorithm, which permutes nonempty segment b[last.u+1..first.v-1] and sets k to truthify

$$last.u < k < first.v \land$$

$$b[last.u + 1..k - 1] < b.k < b[k + 1..first.v - 1] .$$

$$(1.5)$$

Partition does not falsify the invariants R0, R1, R2, and P3. Predicate P4 in the postcondition of Partition follows from (1.5) and R2. Thus, execution of Partition(...) creates a new pivot k. We shall not deal further with Partition(...).

We now deal with the initial truth and the invariance of R0, R1, R2, and P3. R0 is initially true, since initially b=B. The only statement that changes b is Partition(...), and it is guaranteed only to permute b, so R0 remains true.

Consider R1. With u = [-1] and v = [n], and with $n \ge 0$, R1 is initially true. We now show the invariance of R1 with regard to the statement v := k v of the first guarded command. We have,

```
wp(`v := k v', R1)
= \langle \text{Definition of } wp \text{ and } R1 \rangle
increasing(u k v) \wedge first.u = -1 \wedge last.(k v) = n .
```

The first conjunct follows from P4 and R1, and the last two conjuncts follow from R1. Hence, R1 is true after execution of the first guarded command.

Consider the invariance of R1 over the second guarded command. We have

```
wp(`u, v := u \ first.v, tail.v', R1)
= \langle \text{Definition of } wp \text{ and } R1 \rangle
increasing(u \ first.v \ tail.v) \land
first.(u \ first.v) = -1 \land last.(tail.v) = n
= \langle \text{Definition of } first \text{ and } tail \rangle
increasing(u \ v) \land first.(u \ first.v) = -1 \land last.(tail.v) = n
```

The first two conjuncts are implied by R1. The last conjunct holds from R1 provided that tail.v is not empty, which follows from the guard $first.v \neq n$ and conjunct last.v = n of R1.

The proofs of invariance of R2 and P3 are just as simple and can be easily verified informally as well as formally. Hence, they are left to the reader.

So, R0, R1, R2, and P3 are loop invariants and are true upon termination. We now prove that upon termination R3 holds.

```
P3 \land \text{falsity of the loop guards}
= \langle \text{Predicate calculus} \rangle
P3 \land \textit{first.} v - \textit{last.} u \leq H \land \textit{first.} v = n
= \langle R1 \rangle
P3 \land \textit{first.} v - \textit{last.} u \leq H \land v = [n]
= \langle \text{Predicate calculus; One-point rule, } (\forall x \mid x = e : P) \equiv P[x := e] \rangle
```

$$P3 \wedge (\forall I, J \mid (I \ J) \text{ seg } (last.u \ v) : J - I \leq H)$$

$$= \langle \text{Range-split; Definition of } R3 \rangle$$

$$R3$$

To prove termination of the loop, consider the expression (#u + #v) + #u. By R1, it is bounded above by $2 \cdot n + 3$. Its initial value is 3. Each iteration increases it by 1. Hence, there are at most $2 \cdot n$ iterations.

Algorithm (1.2) is a version of Quicksort, as a preprocessor for Insertionsort, in which the sequence of generated pivots is maintained explicitly and the segments of b delimited by those pivots are processed in left-to-right order. The analysis of its expected and worst-case execution times is the same as that of other versions of Quicksort and is left to the reader. Our next step is to provide a coordinate transformation that eliminates variables u and v, leaving a constant-space Quicksort.

A coordinate transformation

Our coordinate transformation replaces variables b, u, v by an array c and integer variables i, j, h. Initially, we assume that b = c, and we prove that, upon termination of the transformed algorithm, again b=c. Thus, the final algorithm Quicksorts c and not b. The relationship between b, u, v and c, i, j, h is given by three coupling invariants C0, C1, and C2. The first coupling invariant defines i, j and h in terms of u and v:

$$C0: i = last.u \land j = first.v \land (h \ n) \mathbf{seg} \ (u \ v)$$

C0 allows replacement expressions last.u and first.v of algorithm (1.2) by i and j. Variable h is the penultimate pivot in sequence uv. It is needed because the segment b[h+1..n-1] has to be handled specially because its delimiting pivot n references the virtual array element b.n instead of a real array element.

The second coupling invariant indicates the segments of b and c that are equal:

$$C1: c[..j] = b[..j] \wedge c[h+1..] = b[h+1..]$$
.

It remains to define c.t for $j < t \le h$. This definition is the key to achieving a constant-space Quicksort. Suppose #v > 2, and introduce V and \overline{v} satisfying $v = j \ V \ \overline{v}$. Note that $V \leq h$. Consider the second guarded command of algorithm (1.2), which sets v to tail.v. In order to maintain C0 when v := tail.v is executed, j has to be set to V, but without referring to v! We make this possible by defining c[j+1..V] appropriately. Suppose b[j+1..V] has the following form:

b
$$\begin{bmatrix} \mathbf{j} & \mathbf{V} \\ & \mathbf{X} & \mathbf{X} & \mathbf{Y} \end{bmatrix}$$
 where $X < x < Y$

where x is a sequence and X and Y are elements. Then, c[j+1..V] has the value shown below:

c
$$\begin{array}{c|c} & \mathbf{j} & \mathbf{V} & \mathbf{n} \\ & & \mathbf{Y} \times \mathbf{X} \end{array}$$
 where $X < x < Y$

Thus, c[j+1..V] is b[j+1..V] with its first and last elements swapped. Since $b[k] \le b.V$ for $j < k \le V$, we have $c[j+1..V] \le c.(j+1)$. Since b.V < b[V+1..], we have c.(j+1) < c[V+1..]. Hence, given j, we can determine V using a linear search (or as we shall see later, a binary search), as the single integer satisfying

$$j < V \le h \land c[j+1..V] \le c.(j+1) < c[V+1..]$$
.

The above analysis gives the main idea behind constant-space *Quicksort*, and if that is all the reader wants they may stop here.

The above analysis, with the pictures, deals poorly with the case j + 1 = V. We now introduce notation to deal rigorously with the definition of c[j + 1..V]. Define function sw(b, p, q), for b an array (segment) and p, q integers, to be

$$sw(b, p, q) = "b" \text{ with } b.p \text{ and } b.q \text{ swapped"}$$
.

Then define c[j+1..V] to be b[j+1..V] with its first and last elements swapped:

$$c[j+1..V] = sw(b[j+1..V], j+1, V)$$

Using this notation, we define all segments of $\,c\,$ that are delimited by pivots in $\,v\,$, except the last:

C2:
$$(\forall I, J \mid (I \ J) \text{ seg } v \land J \neq n : c[I+1..J] = sw(b[I+1..J], I+1, J)$$
.

With this definition of c[j+1..V], the following theorem shows how to find the follower of j in v.

Theorem 0. Given R1, R2, C0, C1, C2, and j < h, the follower of j in v is the unique solution of f.t defined by

$$f.t \equiv j < t \le h \land c.t \le c.(j+1) < c.(t+1) . \tag{1.6}$$

Proof. First, we prove that f.V holds for the follower V of j in v. Since $j < V \le h$, by the definition of c there exists a value p, V < p, such that b.p = c.(V+1). Using this value p, we prove that the second conjunct of f.V holds:

$$c.V \\ = & \langle \text{Definition of } c \rangle \\ b.(j+1) \\ \leq & \langle V \text{ is a pivot and } j+1 \leq V \rangle \\ b.V \\ = & \langle \text{Definition of } c \rangle \\ c.(j+1) & -\text{hence, } c.V \leq c.(j+1) \\ = & \langle \text{Definition of } c \rangle \\ b.V$$

```
\langle V \text{ is a pivot of } b \text{ and } V 
    b.p
       \langle \text{Definition of } c \rangle
<
                   —hence, c.V < c.(j+1) < c.(V+1)
    c.(V+1)
```

Hence, f.V is true. Now consider any value t, $j+1 \le t < V$. Since $b[j+1..V] \le$ b.V, we have $c[j+1..V] \leq c.(j+1)$. Hence, $c(t+1) \leq c.(j+1)$, so f.t is false.

Finally, consider a value t satisfying $V < t \le h$. Since V is a pivot, b.V < b.t. By the definition of c, c(j+1) < ct, so ft is false.

Thus, the follower of j in v is the only solution of f defined by the equation of the theorem. Q.E.D.

We now provide translations of expressions and statements of (1.2). For each expression in u, v, b, we provide an equal expression in i, j, h, c, with the coupling invariants being used to prove equality. For the initialization of u, v we provide initialization for i, j, h such that the simultaneous execution of the initializations truthifies the coupling invariants. Finally, for each other statement of (1.2) that involves u, v, b, we provide an equivalent statement that involves i, j, h, c, such that the coupling invariants are invariantly true over the simultaneous execution of the two statements.

The translation of last.u is i (by C0).

The translation of first.v is j (by C0).

The translation of u, v := [-1], [n] is i, j, h := -1, n, -1. That the two together truthify C0 is trivial. C1 is truthified because initially b=c is assumed. C2 is truthified, with the range of quantification empty.

The translation of Partition(b, last.u + 1, first.v - 1, k) is Partition(c, i + 1, k)(1, j-1, k). By C0 and C1, the two segments of b and c that are being partitioned have the same value, so that executing the two calls leave the segments still equal; further the two calls store the same value in k.

The translation of v := k v is

$$\begin{array}{ll} \textbf{if} \ i = h \rightarrow j, h := k, k \\ \parallel \ i < h \rightarrow \text{Swap} \ c.(k+1), c.j; \ j := k \\ \textbf{fi} \end{array}$$

We prove that this translation is correct. First, $C0 \Rightarrow i \leq h$, so the statement does not abort. We handle the cases i = h and i < h separately. Assume i = h, i.e. we deal with the guarded command j, h := k, k. We prove that C0, C1, and C2 are maintained by it.

$$wp(`v := k \ v; j, h := k, k', C0)$$

$$= \langle \text{Definition of } wp \text{ and } C0 \rangle$$

$$i = last. u \land k = first.(k \ v) \land (k \ n) \text{ seg } (u \ k \ v)$$

The first conjunct is true by R1; the second by the definition of first. Consider the third. From i = h, C0, and R1, we have v = [n], from which the third conjunct follows.

$$wp(`v := k \ v; j, h := k, k', C1)$$

$$= \langle \text{Definition of } wp \text{ and } C1 \rangle$$

$$c[..k] = b[..k] \land c[k+1..] = b[k+1..]$$

$$= \langle \text{Property of arrays} \rangle$$

$$c = b$$

From C0, i = h, and R1, we have j = n. Together with C1, this implies b = c. Hence, C1 is maintained by the first guarded command.

Similarly, C2 remains true —with its range of quantification empty.

Now consider the case i < h, i.e. consider the second guarded command.

$$wp(`v := k \ v ; \text{Swap } c.(k+1), c.j ; j := k', C0)$$

= $i = last.u \land k = first.(k \ v) \land (h \ n) \text{ seg } (u \ k \ v)$

The first conjunct is in R1, the second is true by the definition of first, and the third follows from R1 and i < h.

$$wp(`v := k \ v; \ \text{Swap} \ c.(k+1), c.j; \ j := k`, \ C1)$$

$$= \langle \text{Definition of} \ wp \ \text{and} \ C1 \rangle$$

$$sw(c, k+1, j)[..k] = b[..k] \wedge sw(c, k+1, j)[h+1..] = b[h+1..]$$

$$= \langle \text{By} \ P4 \ \text{and} \ C0, \ i < k < j \le h \rangle$$

$$c[..k] = b[..k] \wedge c[h+1..] = b[h+1..]$$

This follows from k < j and C1.

$$wp(`v := k \ v; \ \text{Swap} \ c.(k+1), c.j; \ j := k`, C2)$$

$$= \langle \text{Definition of} \ wp \ \text{and} \ C2 \rangle$$

$$(\forall I, J \mid (I \ J) \ \text{seg} \ (k \ v) \land J \neq n : sw(c, k+1, j)[I+1...J] = sw(b[I+1...J], I+1, J))$$

$$= \langle \text{Range split: One-point rule; } j = first.v \rangle$$

$$sw(c, k+1, j)[k+1..j] = sw(b[k+1..j], k+1, j) \land C2$$

$$= \langle \text{Interchange of swapping and referencing a subsegement} \rangle$$

$$sw(c[k+1...j], k+1, j) = sw(b[k+1...j], k+1, j) \land C2$$

$$= \langle \text{Property of swap} \rangle$$

$$c[k+1...j] = b[k+1...j] \land C2$$

The first conjunct follows from C1.

The translation of $u, v := u \ first.v, tail.v$ is

```
\begin{array}{l} i := j;\\ \textbf{if } i = h \rightarrow \ j := n\\ \begin{subarray}{l} i < h \rightarrow \ j := V \ , \ \text{where} \ V \ \ \text{satisfies} \ f.V \ \ (\text{see} \ (1.6));\\ \begin{subarray}{l} \text{Swap} \ c.(i+1), c.j \ \end{subarray} \end{array}
```

The proof of correctness of this replacement is similar to that of the previous replacement and is left to the reader. The key, of course, is Theorem 0.

Using binary search

Even though c[j+1..h+1] is not sorted, binary search can be used to find V that satisfies f.V (see (1.6)), as required in the translation of u,v:=u first.v, tail.v. Here, without much explanation, is a binary search algorithm due to E.W. Dijkstra, written as a procedure:

```
{Let initially p = P and q = Q. Given is c.p \le x < c.q. Set p to
truthify the following, while referencing only elements of c[P+1..Q-1]:
     P \le p < Q \land c.p \le x < c.(p+1)
procedure bsearch(\mathbf{var}\ b:\mathbf{array}\ ;\ \mathbf{var}\ p:int;\ q,x:int);
{invariant: P \le p < q \le Q \land c.p \le x < c.q}
do p + 1 \neq q \rightarrow  var e := (p + q) \div 2;
                   \{P 
                   if c.e \leq x \rightarrow p := e
                    [ c.e > x \to q := e
od
```

This algorithm is readily seen to satisfy its specification, though c[P..Q] need not be ordered. Since the value V that satisfies (1.6) is unique, the following statement stores the desired value V in j:

$$j := i + 1; \ bsearch(c, j, h + 1, c.(i + 1))$$
 (1.7)

The final algorithm

Making the replacements in algorithm (1.2) that are described in the previous section yields the following algorithm. It would be nice to have a program construct to perform such a coordinate transformation automatically, given the statements and expressions to be replaced and their replacements.

```
var i, j, h := -1, n, -1;
do j - i > H \rightarrow \text{var } k;
                        Partition(c, i + 1, j - 1, k);
                       if i = h \rightarrow j, h := k, k
                        [i < h \rightarrow \text{Swap } c.(k+1), c.j; j := k]
  [] j-i \leq H \land j \neq n \rightarrow i := j;
                       if i = h \rightarrow i := n
```

$$[] \ i < h \rightarrow j := i+1; \ bsearch(c,j,h+1,c.(i+1));$$

$$Swap \ c.(i+1),c.j$$

$$\mathbf{fi}$$

od

Note that, from the falsity of the guards of the loop, we have j = n; together with C1, this implies b = c.

This algorithm requires only constant extra space. In return, for each pivot created it requires two swaps and a binary search of b[j..h], which takes at most logarithmic time. Since there are at most n+2 pivots, the algorithm remains $O(n \cdot log.n)$.

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