Simulation Experiment for Proofing the Theoretical Assumption of Time Complexity for Binary Search Tree

Muna M. Salih
Technical College of Management/Baghdad
munaouceal@yahoo.co.uk

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Abstract

It is frequently asserted that an advantage of a binary search tree implementation of a set over linked list implementation is that for reasonably well balanced binary search trees the average search time (to discover whether or not a particular element is present in the set) is \( O(\log N) \) to the base 2 where \( N \) is the number of element in the set (the size of the tree).

This paper presents an experiment for measuring and comparing the obtained binary search tree time with the expected time (theoretical), this experiment proved the correctness of the hypothesis, the experiment is carried out using a program in turbo Pascal with recursion technique implementation and a statistical method to prove the above hypothesis. Search time is estimated by the number of comparisons needed.

Keywords: Time Complexity, Binary Search Tree, Big O Notation, Recursive Method, Chi square.

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Introduction

A binary tree is a special kind of tree, one that limits each node to no more than two children. A binary tree, or BST, is a binary tree whose nodes are arranged such that for every node N, all of the nodes in N's left subtree have a value less than N, and all nodes in N's right subtree have a value greater than N. In the average case BSTs offer log(N) to the base 2 asymptotic time for inserts, deletes, and searches[1].

Binary search tree is a fundamental technique of programming, the advantage of using a binary search tree over an array is that a tree enables search, insertion, deletion operation to be performed efficiently [2].

Using simple calculation we can see that O(log N) is better than O(N) (the search time for an array). (In computer science, big O notation is used to classify algorithms by how they respond (e.g. in their processing time or working space requirements) to changes in input size)[3].

So let's say that we have 8 items that we place into an array and a binary tree. In the array, search time will be O(8) = 8. In the binary tree, search time will be O(log 8) = 3. We can see that 3 < 8 here. So the binary tree would be a better choice.

Hypothesis

1- for reasonably well balanced binary search trees the average search time (to discover whether or not a particular element is present in the set) is O(log N) to the base 2 where N is the number of element in the set (the size of the tree).

2- A binary search tree requires approximately 1.39(log(n)) comparisons if keys are inserted in random order[4].

Searching Technique

Searching a binary tree for a specific value can be a recursive or iterative process. This paper covers a recursive method (A recursive object is one that is defined partially in terms of itself)[5].

By examining the root node four cases arise. If the tree is null, the value we are searching for does not exist in the tree. Otherwise, if the value equals the root, the search is successful. If the value is less than the root, search the left subtree. Similarly, if it is greater than the root, search the right subtree. This process is repeated until the value is found or the indicated subtree is null. If the searched value is not found before a null subtree is reached, then the item must not be present in the tree [6].

The shape of the binary search tree clearly determines the efficiency of the binary search algorithm. The optimal binary tree for a given set of entries has minimal height (The height of the Binary Search Tree equals the number of links from the root node to the deepest node) and is well balanced in the sense that the root of every subtree of binary tree has as many left descendants as it has right descendants. In practice when there are dynamic insertions and deletions we are unlikely to maintain a perfectly balanced search tree [5].

Proposed Design and Data Structure for Binary Search Tree

A range of randomly generated sets of suitably different sizes each of which is tested for the presence of a range of randomly generated integers. A set is represented by a pointer, named P therefore; the sets variable is P which points to a record consist of three fields namely:

Left: a pointer to a set of records.
Right: a pointer to a set of records.
Value: the value that the user is interested in.
In this section we shall work out the algorithms based on the best strategy to solve the problems, and compute the time complexity of the algorithms. This problem is related to searching recursively. Figure No.(1) shows the flowchart of the search technique.

A package (i.e. collections of functions and procedures) is developed; this package when declared at the outermost level of a program together with appropriate type declarations would make the following standard set operations available within the program:

**Create:** create an empty set (function).
**Insert:** Insert a given element into a given set (procedure), (do nothing if the element is already in the set).
**Comsion:** detect if a given element is present in a given set (function).
**Size:** return the size of a given set (function).
**Writset:** write out the contents of a given set in ascending numerical order (procedure). The package implements the sets using binary search trees.

Once the binary tree is created, its elements can be retrieved in-order by recursively traversing the left subtree of the root node, accessing the node itself, then recursively traversing the right subtree of the node, continuing this pattern with each node in the tree as its recursively accessed. The package obtains the store required from the sets from the Pascal heap (i.e. the free store system), the domain of the sets provided is the positive integers available in Pascal, a pseudo-random number sequence is set up by declaring functions Random and Randint. And declaring and initializing the sequence carrier C. A comparison is made each time the value at a node of the binary search tree is inspected, Figure No.(2) shows part of the program code.

**Statistical Method**

The chi-square method is used here to test the ‘Goodness of fit’ of a function. The value of chi-square is calculated by the following formula [7]:

\[
\text{Chi-sq} = \text{summation} \left( \frac{sqr(\text{Oi}-\text{Ei})}{\text{Ei}} \right) \quad \text{Where}
\]

\[
\text{Oi} = \text{Obtained value in the ith observation};
\]
\[
\text{Ei} = \text{Expected value in the ith observation}
\]

Our tested hypothesis is: for reasonably well balanced binary search trees the average search time is \( O(\log N) \) to the base 2.

That means If it is balanced, worst case is \( O\left( \frac{\ln(N)}{\ln(2)} \right) \).Where N is the number of values and the \( \ln(2) \) comes from a base 2 logarithm. If it is an unbalanced binary tree, \( O\left( \frac{\ln(n)}{\ln(2)} \right) \) is best-case. Worst case is \( O(n) \).

The mathematical expression \( O\left( \frac{\ln(N)}{\ln(2)} \right) \) is used to compute the Expected search time according to the size of the tree. This value is compared with the Obtained time (average number of comparisons).

The result after running the program is listed in Table No.(1) below. The curve of Obtained time (time obtained from the experiment) compared to the expected time is shown in Figure No. (3).

**Conclusion**

The first hypothesis, the conclusion is that binary search is said to run in a number of steps proportional to the logarithm of the length of the list being searched, or in \( O(\log(N)) \),not exceeding this value if the tree is balanced and this value could be as average if it is unbalanced.

The value of Chi-square for sample of size 20 (D.F. 19) is (30.1), with 5% level of confidence. It means that if our Chi-square value is found to be greater than (30.1), we shall reject the above hypothesis. By doing so, we have a probability of 5% of making a wrong rejection.
Calculating our Chi-square value yield the value (9.5), therefore we shall not reject the above hypothesis so we accept it to be true.

Table No. (1) below shows the test is quite good where the size of the tree is 5, 10, 15, 30, 65, this leads us to assume that these trees are well balanced or almost balanced. In this experiment we have not ensure that all the trees are well balanced.

However, since 20 trees have been taken (which is not too small sample) and those inserted elements were generated from a pseudo random number, there is reason to believe that the trees are not too unbalanced, and the above hypothesis can be tested by the experimental result.

For the second hypothesis, a binary search tree requires approximately $1.39 \log(n)$ comparisons if keys are inserted in random order. Therefore, the average number of comparisons is only about 40% higher than the best possible (See Table No.(1) the column Obtained/Expected which shows this fact), Figure No.(3) shows the comparisons between the obtained and the expected time of the binary search tree. However there was only one odd value and this is where the size of the tree is 85 which resulted in 56% higher and this is due to imbalance of the tree.

References
3. big O, notation, lastmodified on 1 September (2011). From Wikipedia, the free encyclopedia.
Table No.(1): Obtained time (obtained from the proposed method) Compared with the Expected Time, the Ratio between the Two Shows that the Obtained Time is about 40% Higher as a Maximum

<table>
<thead>
<tr>
<th>Tree size</th>
<th>Obtained time</th>
<th>Expected time</th>
<th>Obtained/Expected</th>
</tr>
</thead>
<tbody>
<tr>
<td>5</td>
<td>2.10E+00</td>
<td>2.32E+00</td>
<td>9.04E-01</td>
</tr>
<tr>
<td>10</td>
<td>3.60E+00</td>
<td>3.32E+00</td>
<td>1.08E+00</td>
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<td>15</td>
<td>4.20E+00</td>
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<td>1.08E+00</td>
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<td>4.32E+00</td>
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<td>100</td>
<td>9.00E+00</td>
<td>6.64E+00</td>
<td>1.35E+00</td>
</tr>
</tbody>
</table>
Figure No.(1): Flowchart of the Proposed Binary Search Technique

Start

Generate random numbers using the expression \( \text{trunc}(500 \times \text{random}(c)) + 1 \)

create 20 trees using the procedure new, insert random numbers into the 20 trees with different sizes

Generate 10 numbers, search for them into one tree using binary search

count the number of comparisons until number is found or end of list

Find the average of comparisons for the 10 elements

Find the log of size of the tree using the expression \( \log \frac{n}{\log 2} \)

20 trees being searched?

yes

Compare log of size with the average of comparisons

Write result into file

End

no

program exp;
type p=^node; node=record left:p; right:p; value:integer; end;

var somesets:array[1..20] of p; count,c,i,j:integer; totcount,xx,ff:integer;

f:text; ch:char; average,loog,cott:real;

function random(var c:integer):real;
begin  c:=26317*c+1;  random:=abs(c/32767)  end;

function randint:integer;
begin  randint:=trunc(500*random(c))+1   end;

function create:p;
begin  create:=nil;  end;

procedure insert(n:integer;var t:p);
begin  if t=nil then
begin
new(u);  u^.left:=nil;  u^.right:=nil;  u^.value:=n;  t:=u;  end;
if n<t^.value then insert(n,t^.left);  if n>t^.value then insert(n,t^.right);  end;

function comsion(n:integer;t:p):integer;
var found:boolean;
begin
found:=false;count:=0;  while(not found) and (t<>nil) do
begin
if t^.value=n then
begin found:=true; count:=count+1; end
else
begin  if t^.value>n then
begin t:=t^.left;  count:=count+1; end
else
begin  t:=t^.right;  count:=count+1 end;  end;
end;
end;

Figure No. (2): Part of Binary Search Program Code
Figure No.(3) Comparisons between the Obtained and the Expected Time of the Binary Search Tree Technique
تجربة محاكاة لبرهنة الافتراض النظري لتقديرات الوقت للبحث الثنائي الشجري
مني مهدي صالح
الكليه التقنيه الادارية/ هيئة التعليم التقني/ بغداد
munaouceal@yahoo.co.uk

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الخلاصة

نيل الاستدلال المبكر في التطبيق تقنية البحث الثنائي الشجري لمعالجة مجموعة ما له فاعلية على تطبيق تقنية الفائدة الموصولة، إذ إنه في البحث الشجري الثنائي المتوازن فإن معدل وقت البحث (التحري) عن وجود عنصر معين في مجموعة (الأساس 2) إذ (log N) هو عدد العناصر في الشجرة أو حجم الشجرة.

هذة التجربة مقدمة لقياس وتقييم وقت البحث الثنائي الشجري المستوحى من الوقت المتوقع (نظرية)، هذه التجربة العملية الثالث صح في الفرضية، نفذت هذه التجربة باستخدام برنامج زرب باسكال مع تطبيق تقنية الاستدعاء الذاتي، واستخدام طريقة إحصائية لأثبات الفرضية أعلاه، تم تقدير وقت البحث بواسطة عدد المقارنات المطلوبة.

الكلمات المفتاحية: Time Complexity, Binary Search Tree, Big O Notation, Recursive Method, Chi-Square.