## Encoding Nearest Larger Values

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### Abstract

In nearest larger value (NLV) problems, we are given an array A[1..n] of distinct numbers, and need to preprocess A to answer queries of the following form: given any index  $i \in [1, n]$ , return a "nearest" index j such that A[j] > A[i]. We consider the variant where the values in A are distinct, and we wish to return an index j such that A[j] > A[i] and |j - i| is minimized, the nondirectional NLV (NNLV) problem. We consider NNLV in the encoding model, where the array A is deleted after preprocessing.

The NNLV encoding problem turns out to have an unexpectedly rich structure: the *effective entropy* (optimal space usage) of the problem depends crucially on details in the definition of the problem. Of particular interest is the tiebreaking rule: if there exist two nearest indices  $j_1, j_2$  such that  $A[j_1] > A[i]$ and  $A[j_2] > A[i]$  and  $|j_1 - i| = |j_2 - i|$ , then which index should be returned? For the tiebreaking rule where the rightmost (i.e., largest index) is returned, we encode a path-compressed representation of the Cartesian tree that can answer all NNLV queries in 1.89997n + o(n) bits, and can answer queries in O(1) time. An alternative approach, based on *forbidden patterns*, achieves the same space bound and query time, and (for a slightly different tiebreaking rule) achieves 1.81211n + o(n) bits. Finally, we develop a fast method of counting distinguish-

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able configurations for NNLV queries. Using this method, we prove a lower bound of  $1.62309n - \Theta(1)$  bits of space for NNLV encodings for the tiebreaking rule where the rightmost index is returned.

*Keywords:* Data structures, encoding data structures, succinct data structures.

### 1. Introduction

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Nearest Larger Value (NLV) problems have had a long and storied history. Given an array A[1..n] of values, the objective is to preprocess A to answer queries of the general form: given an index i, report the index or indices nearest to i that contain values strictly larger that A[i]. If no such index exists, then A[i] is the maximum element in A, and we return -1.

Berkman et al. [1] studied the parallel pre-processing for this problem and noted a number of applications, such as parenthesis matching and triangulating monotone polygons. The connection to string algorithms for both the data struc-

turing and the pre-processing variants of this problem is since well-established.

Since the definition of "nearest" is a bit ambiguous, we propose replacing it by one of the following options in order to fully specify the problem:

- Unidirectionally nearest: the solution is the index  $j \in [1, i-1]$  such that A[j] > A[i] and i j is minimized.
- Bidirectionally nearest: the solution consists of indices  $j_1 \in [1, i-1]$  and  $j_2 \in [i+1, n]$  such that  $A[j_k] > A[i]$  and  $|i-j_k|$  is minimized for  $k \in \{1, 2\}$ .
  - Nondirectionally nearest: the solution is the index j such that A[j] > A[i] and |i − j| is minimized. As far as we are aware, this formulation has not been considered before.
- Furthermore, the data structuring problem has different characteristics depending on whether we consider the elements of A to be distinct (Berkman et al. considered the undirectional variant when all elements in A are distinct).

We consider the problem in the *encoding* model, where once the data structure to answer queries has been created, the array A is deleted. Since it is not possible to reconstruct A from NLV queries on A, the *effective entropy* of NLV

possible to reconstruct A from NLV queries on A, the *effective entropy* of NLV queries [2], the log (base 2) of the number of distinguishable NLV configurations, is very low and an NLV encoding of A can be much smaller than A itself. The encoding variant has several applications in space-efficient data structures for string processing, in situations where the values in A are intrinsically unin-

- <sup>30</sup> teresting. Results on encoding NLV problems include (all of the space bounds below are tight to within lower-order terms):
  - The bidirectional NLV when A contains distinct values boils down essentially to encoding a Cartesian tree, through which route 2n + o(n)-bit and O(1)-time data structures exist [3, 4].
- The unidirectional NLV when A contains non-distinct values can be encoded in 2n + o(n) bits and queries answered in O(1) time [5, 6]. For the unidirectional NLV the bound is tight even when all values are distinct: we can perturb any instance of the unidirectional problem with non-distinct values in such as way as to preserve the solutions to all queries.<sup>1</sup>
- The bidirectional NLV for the case where elements in A need not be distinct was first studied by Fischer [7]. His data structure occupies  $lg(3 + 2\sqrt{2})n + o(n) \approx 2.544n + o(n)$  bits of space<sup>2</sup>, and supports queries in O(1) time.

In this paper, we consider the nondirectionally nearest larger value (NNLV)  $_{45}$  problem, in the case that all elements in A are distinct. The above results

<sup>&</sup>lt;sup>1</sup>More details: given any array with non-distinct elements for the unidirectional problem, we first reduce the values of the elements to their ranks (allowing ties). We then tweak the values so that the rightmost of each duplicated value x is  $x + \varepsilon$  for some  $\varepsilon \in (0, 1)$ . We then reduce  $\varepsilon$  by some positive amount such that it is remains positive, and repeat this step until all elements are distinct.

<sup>&</sup>lt;sup>2</sup>We use  $\lg x$  to denote  $\log_2 x$ .

already hint at the combinatorial complexity of NLV problems. However, the NNLV problem appears to be even richer, and the space bound appears not only to depend upon whether A is distinct or not, but also upon the specific tie-breaking rule to use if there are two equidistant nearest values to the query index i.

For instance, given a location i where there is a tie, we might always select the larger value to the right of location i to be its nearest larger value. We call this *rule I*. We give an illustration in the middle panel of Figure 1 (on page 8). Alternative tie breaking rules might be: to select the smallest of the two larger values (*rule II*), or to select the larger of the two larger values (*rule III*). Interestingly, it turns out that the tie breaking rule is important for the space bound. That is, if we count the number of distinguishable configurations of the NNLV problem for the various tie breaking rules, then we get significantly different answers. We counted the number of distinguishable configurations, for

problem instances of size  $n \in [1, 12]$ , and got the sequences presented in Table 1.

Unfortunately, none of the above sequences appears in the Online Encyclopedia of Integer Sequences<sup>3</sup>. Consider the sequence generated by some arbitrary tie breaking rule. If  $z_i$  is the *i*-th term in this sequence, then  $\lim_{n\to\infty} \lg(z_n)/n$ is the constant factor in the asymptotic space bound required to store all the answers to the NNLV problem subject to that tiebreaking rule.

### 1.1. Our Contributions

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Our main results are as follows. First, we present the following upper bound:

**Theorem 1.** Let A[1..n] be an array containing distinct numbers. The array A can be processed to obtain an encoding data structure that occupies 1.89997n + o(n) bits of space, that can answer the query NNLV(A, i) in O(1) time for any  $i \in [1, n]$ . Ties are resolved using rule I. At no point after preprocessing does the data structure require access to the array A.

<sup>&</sup>lt;sup>3</sup>https://oeis.org/

e 2: Summary	2: Summary of results for the nearest larger value problem. The column distinct specifies whether the values are specified to be distinct or n	alue problem. The colum	in distinct specifies whether	the values	are specified to be distinct or n
column space t	column space bound indicates the type of result: "Matching Bounds" means that the bound presented is optimal to within lower order term	t: "Matching Bounds" n	neans that the bound prese	nted is opt	imal to within lower order term
Distinct	Distinct Problem	Bound Type	Space	Query	Query Reference
	Unidirectional	Matching Bounds $2n + o(n)$	2n + o(n)	O(1)	O(1) Cartesian Tree [5, 6]
$\mathbf{V}_{22}$	Bidirectional	Matching Bounds $2n + o(n)$	2n + o(n)	O(1)	Cartesian Tree $[3, 4]$
162	Nondirectional (rule I)	Upper Bound	1.89997n + o(n)	O(1)	Sections 3 and 6
	Nondirectional (rule III) Upper Bound	Upper Bound	1.81211n + o(n)	O(1)	Sections 5 and 6
	Nondirectional (rule I)	Lower Bound	$1.62309n - \Theta(1)$		Section 8
M	Unidirectional	Matching Bounds $2n + o(n)$	2n + o(n)	O(1)	O(1) Cartesian Tree [5]
0N1	Bidirectional	Matching Bounds	Matching Bounds $\left  \log(3 + 2\sqrt{2})n + o(n) \right  O(1)$	O(1)	Schröder Trees [7]

blem. The column distinct specifies whether the values are specified to be distinct or not.	ing Bounds" means that the bound presented is optimal to within lower order terms.
Table 2: Summary of results for the nearest larger value proble	The column space bound indicates the type of result: "Matchi

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Table 1: Number of distinguishable configurations of nearest larger value problems with the three tiebreaking rules discussed.

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rule III rule II rule I u

As mentioned before, the Cartesian tree (defined later) occupies 2n+o(n) bits and can solve NNLV queries. In Section 3 we describe a novel *path-compressed* 

- representation of a binary tree that uses  $2n + O(\lg n)$  bits (but supports no operations). To get the improved space bound of Theorem 1 we prove combinatorial properties of the NNLV problem relating to chains of degree one nodes in the Cartesian tree. These properties allow us to compress the Cartesian tree using the representation of Section 3, losing some information, but still retaining the
- <sup>80</sup> ability to answer NNLV queries. The constant factor (1.89997) comes from a numeric calculation bounding the worst case structure of chains in the Cartesian tree for our compression scheme (Section 4). Later, in Section 6 we show how to support operations on the "lossy" Cartesian tree, thereby proving Theorem 1.

We also present an alternate construction, based on forbidden patterns in

<sup>85</sup> binary strings, in Section 5. This construction is simpler than that of Section 3, and also achieves a better upper bound for a different tiebreaking rule.

**Theorem 2.** Let A[1..n] be an array containing distinct numbers. The array A can be processed to obtain an encoding data structure that occupies 1.81211n + o(n) bits of space, that can answer the query NNLV(A, i) in O(1) time for any

 $i \in [1, n]$ . Ties are resolved using rule III. At no point after preprocessing does the data structure require access to the array A.

After discussing upper bounds, in Section 7 we discuss methods to efficiently enumerate the number of distinguishable configurations of arrays of size n with respect to NNLV queries (subject to tiebreaking rule I). Using these methods we are able to extend the row for rule I of Table 1 to n = 700.

Using this extended table, in Section 8, we prove the following lower bound:

**Theorem 3.** Any encoding data structure that can answer the query NNLV(A, i) for any  $i \in [1, n]$  (breaking ties according to rule I) must occupy at least  $1.62309n - \Theta(1)$  bits, for sufficiently large values of n.

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A summary of the known results for all variants of the NLV problem can be found in Table 2. We leave the variant of the NNLV problem for non-distinct values as future work.

### 1.2. Other Related Work

- Asano et al. [8] studied the time complexity of computing all nearest larger values in an array as well as higher dimensions, and mention applications to communication protocols. Asano and Kirkpatrick [9] considered sequential timespace tradeoffs for computing the nearest larger values of all elements in the array. When A is a random permutation, the expected effective entropy of the bidirectional NLV problem was shown to be 1.74n + o(n) bits by Golin et
- al. [2]. Finally, Jayapaul et al. [6] studied the nearest larger value problem in two dimensional arrays.

### 2. Cartesian Tree Review

Given a binary tree T, let d(v) denote the degree (i.e., number of children) of node v, and p(v) denote the parent of v. We define the rank r(v) to be the inorder rank of the node v in the binary tree T. Define the range of a node v to be the range  $[e_1(v), e_2(v)]$ , where  $e_1(v)$  (resp.  $e_2(v)$ ) is the inorder rank of the leftmost (resp. rightmost) descendant of v.

Suppose we are given an array A[1..n] which stores an n element permutation  $\pi$ , i.e.,  $A[i] = \pi(i)$ . The Cartesian tree of A[1..n] is the n node binary tree Tsuch that the root v of T has rank  $r(v) = \arg \max_i A[i]$ . If r(v) > 1, then the left child of v is the Cartesian tree of A[1..r(v) - 1], otherwise it has no left child. If r(v) < n then the right child of v is the Cartesian tree of A[r(v) + 1..n], otherwise it has no right child. Figure 1 (bottom panel) illustrates the Cartesian tree of an example array (top panel).

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We require the following technical lemma about Cartesian trees:

**Lemma 1.** Consider a node v in a Cartesian tree T having range  $[e_1(v), e_2(v)]$ . If  $e_1(v) - 1 \ge 1$  then  $A[e_1(v) - 1] > A[r(v)]$ . Similarly, if  $e_2(v) + 1 \le n$  then  $A[e_2(v) + 1] > A[r(v)]$ .

# $\begin{array}{c} 30\\ \hline 22\\ \hline 18\\ \hline 12\\ \hline 13\\ \hline 13\\ \hline 12\\ \hline 13\\ \hline$

Figure 1: Top: an array containing a permutation of  $\{1, \ldots, 30\}$ . Middle: The tree structure of the NNLV problem. Here the parent of a node represents its NNLV, breaking ties by selecting the element on the right (rule I). Bottom: The Cartesian tree.

*Proof.* If v is the root of T, then  $e_1(v) - 1 = 0$  and  $e_2(v) + 1 = n + 1$ , and the lemma holds trivially. Thus, suppose p(v) exists. Since the Cartesian tree is 130 binary, we have two cases: (i)  $e_1(p(v)) = e_1(v)$ , which implies  $r(p(v)) = e_2(v) + 1$ and therefore  $A[e_2(v) + 1] > A[r(v)]$ ; or (ii)  $e_2(p(v)) = e_2(v)$ , which implies  $r(p(v)) = e_1(v) - 1$ , and therefore  $A[e_1(v) - 1] > A[r(v)]$ . This proves the lemma in the case where either  $e_1(v) - 1 = 0$  or  $e_2(v) + 1 = n + 1$ . Next, suppose that both  $e_1(v) - 1 \ge 1$  and  $e_2(v) + 1 \le n$ . Thus, let u be the closest 135 ancestor of v such that  $e_1(u) \neq e_1(v)$  and  $e_2(u) \neq e_2(v)$ . By the definition of  $u, u \neq p(v)$ . Consider the child of u, denoted w, that contains v in its subtree. There are two cases: (i)  $e_2(w) = e_2(v)$ , which implies  $r(u) = e_2(v) + 1$  and therefore  $A[e_1(v) - 1] = A[r(p(v))] > A[r(v)]$  and  $A[e_2(v) + 1] = A[r(u)] > A[r(v)]$ A[r(v)]; or (ii)  $e_1(w) = e_1(v)$ , which implies  $r(u) = e_1(v) - 1$ , and therefore 140  $A[e_1(v) - 1] = A[r(v)] > A[r(v)]$  and  $A[e_2(v) + 1] = A[r(p(v))] > A[r(v)].$  *NLV and Cartesian Trees.* Lemma 1 is key to using the Cartesian tree for computing NLVs. Let v be a node in a Cartesian tree with range  $[e_1(v), e_2(v)]$ . Then the following observations are immediate:

- 1. If  $e_1(v) > 1$  then  $e_1(v) 1$  is the nearest larger value to the left of A[r(v)]. If  $e_1(v) = 1$  then there is no larger value to the left of A[r(v)].
  - 2. If  $e_2(v) < n$  then  $e_2(v)+1$  is the nearest larger value to the right of A[r(v)]. If  $e_2(v) = n$  then there is no larger value to the right of A[r(v)].

Thus, by comparing  $r(v) - e_1(v)$  and  $e_2(v) - r(v)$  we can obtain NNLV(A, r(v))according to the break rule I.

If  $e_1(v) > 1$ , then let w be the vertex corresponding to  $A[e_1(v) - 1]$ . If  $e_2(v) < n$ , then let x be the vertex corresponding to  $A[e_2(v) + 1]$ . The following observations follow directly from the definition of the Cartesian tree.

1. If  $e_1(v) = 1$  and  $e_2(v) = n$  then v is the root of the Cartesian tree.

- 155 2. If  $e_1(v) > 1$  and  $e_2(v) = n$  then w = p(v).
  - 3. If  $e_1(v) = 1$  and  $e_2(v) < n$  then x = p(v).
  - 4. If  $e_1(v) > 1$  and  $e_2(v) < n$  either w or x is p(v).

Assume that  $e_1(v) > 1$  and  $e_2(v) < n$ . We now argue that either w is a descendant of x, or vice versa. If not, let u be the LCA of w and x. Clearly A[r(u)] is greater than both  $A[e_1(v)-1]$  and  $A[e_2(v)+1]$ , and hence, by Lemma 1, A[r(u)] > A[r(v)]. However  $e_1(v) - 1 < r(u) < e_2(v) + 1$ , i.e. r(u) is within the extent of v, a contradiction. Thus, we can break ties according to rules II or III as well, by seeing if  $r(p(v)) = e_1(v) - 1$  or  $r(p(v)) = e_2(v) + 1$ .

### 3. A Path Based Tree Representation

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Consider an arbitrary rooted binary tree T with n nodes. We next describe a path-based encoding of such a tree that occupies no more than  $2n + \Theta(\lg n)$ bits.

We identify all maximal chains  $v_1, ..., v_{\ell}, v_{\ell+1}$  such that:

1. Either  $v_1$  is the root of T, or  $d(p(v_1)) = 2$ ;

2.  $d(v_i) = 1$  for  $i \in [1, \ell]$ , and; 170

3.  $d(v_{\ell+1}) \in \{0, 2\}.$ 

We refer to  $v_{\ell+1}$  as the *terminal* of the chain. Iteratively, we remove each such maximal chain: i.e., the nodes  $v_1, ..., v_\ell$  are removed from the tree. If  $v_1$ was the root, then  $v_{\ell+1}$  is set to be the new root. Otherwise,  $v_{\ell+1}$  is set to be the left (resp. right) child of  $p(v_1)$  iff  $v_1$  was the left (resp. right) child of 175  $p(v_1)$ . We call the chain *left hanging* if  $p(v_1)$  had  $v_1$  as a left child, and *right* hanging otherwise. After removing all such maximal chains, the tree T' that remains is a full binary tree (i.e., it has no nodes of degree one) and has  $n' \leq n$ nodes. Suppose that we have removed k nodes, for some  $k \in [0, n-1]$ , and so

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$$n = n' + k$$
.

Suppose there are m maximal chains removed during the process just described. We now describe the representation of the original tree T.

- We store the tree T', which is a full binary tree and requires n' + O(1)bits to represent.
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• We store a bitvector B of length n'. Bit B[i] = 1 iff the node v, corresponding to the *i*-th node in an inorder traversal of T', is the terminal of a removed chain. This requires  $\lceil \lg {n' \choose m} \rceil$  bits.

- Suppose we order the subset of nodes that are terminals by their inorder rank in T', and that v is the terminal ordered *i*-th. We refer to the chain having v as its terminal as  $C_i$ , and its length as  $c_i$ . We store a bitvector L of length k, which represents the lengths of each removed chain; i.e., the values  $c_1, ..., c_m$ . Let  $p_i = \sum_{j=1}^i c_i$  for  $i \in [1, m]$ . Then  $L[p_i] = 1$  for  $i \in [1, m]$ , and all other entries of L are 0. As L is a bit sequence of length k with m one bits, it can be stored using  $\lfloor \lg \binom{k}{m} \rfloor$  bits.
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• For each chain  $C_i = \{v_1, ..., v_{c_i}\}$  having terminal node  $v_{c_i+1}$ , we store a bitvector  $Z_i$  of length  $c_i$ , in which  $Z_i[j] = 0$  if  $v_{j+1}$  is the left child of  $v_j$ , and  $Z_i[j] = 1$  otherwise. Let Z be the concatenation of each  $Z_i, i \in [1, m]$ and is of length k. We store Z naively using k bits.

We call the above data structures, bitvectors B, L, Z and the tree T' the path compressed representation of T. Note that to decode this and recover the tree T, we require the value of n and n'. These can be stored using an additional  $\Theta(\lg n)$  bits. By summing the above space costs, we get the following lemma.

**Lemma 2.** The path compressed representation of an arbitrary binary tree T completely describes the combinatorial structure of T, and can be stored using  $n' + \lg \binom{n'}{m} + \lg \binom{k}{m} + k + \Theta(\lg n) \le 2n' + 2k + \Theta(\lg n) = 2n + \Theta(\lg n)$  bits.

### 4. Encoding Nearest Larger Values

In this section we show how to use the path compressed tree representation to compress Cartesian trees—losing some information in the process—but still retaining the ability to answer NNLV queries. Our key observation is that chains in the Cartesian tree can be compressed to save space, as illustrated by the following lemma:

**Lemma 3.** Consider the set of all possible chains with  $c_i$  deleted nodes in a path compressed representation of a Cartesian tree, excluding chains having nodes representing array elements A[1] or A[n]. There are exactly  $c_i + 1$  combinatorially distinct chains with respect to answering nearest larger value queries, breaking ties according to rule I.

Proof. Consider a chain with  $c_i$  deleted nodes,  $\{v_1, ..., v_{c_i}\}$ , where  $v_{c_i+1}$  is the terminal. Clearly,  $v_1$  represents the maximum element in the chain, and either  $r(v_j) = e_1(v_j)$  or  $r(v_j) = e_2(v_j)$  for each  $j \in [1, c_i]$ . This follows because since if  $v_j$  is in a chain it is either the left or right endpoint of the range  $[e_1(v_j), e_2(v_j)]$ . In turn, this implies that the range  $[e_1(v_1), e_2(v_1)]$  has a deleted prefix and deleted suffix which in total contain the inorder ranks of the  $c_i$  deleted nodes.

The deleted nodes corresponding to this prefix (resp. suffix) appear contiguously in the array A, and form a decreasing (resp. increasing) run of values in A. Furthermore, by Lemma 1, and since  $1, n \notin [e_1(v_1), e_2(v_1)]$  (by the assertion in the statement of the lemma), we can assert that both  $A[e_1(v_1) - 1] > A[e_1(v_1)]$ and  $A[e_2(v_1) + 1] > A[e_2(v_1)]$ . Thus, for each k such that  $v_k$  is in the prefix we have that  $A[e_1(v_k) - 1] > A[e_1(v_k)]$ , and we can return the nearest larger value of  $r(v_k) = e_1(v_k)$  to be  $e_1(v_k) - 1$ . Similarly, for each k such that  $v_k$  is in the suffix we have that  $A[e_2(v_k) + 1] > A[e_2(v_k)]$ , and return the nearest larger value of  $r(v_k) = e_2(v_k)$  to be  $e_2(v_k) + 1$ .

This implies that, if we know the value  $c_i$ , then we additionally need only know how many nodes are in the prefix in order to determine the answer to a nearest larger value query for any index represented by a deleted node. There are at most  $c_i + 1$  possible options:  $\{0, ..., c_i\}$ . Moreover, for an arbitrary index  $i \in [1, n] \setminus [e_1(v_1), e_2(v_1)]$  the answer to a nearest larger value query cannot be in  $[e_1(v_1), e_2(v_2)]$ , since this range is sandwiched between larger values by Lemma 1. Finally, consider indices in the range  $[e_1(v_{c_i+1}), e_2(v_{c_i+1})]$ . Using the fact that  $A[e_1(v_{c_i+1}) - 1]$  and  $A[e_2(v_{c_i+1}) + 1]$  by are larger than all elements

- in  $A[e_1(v_{c_i+1}), e_2(v_{c_i+1})]$  by Lemma 1, we can correctly answer queries for a position *i* in the subtree. First, we find the solution to the NNLV query within the subtree, and denote the index as *j*. Then, we return the nearest position to *i* of either *j*,  $e_1(v_{c_i+1}) - 1$ , or  $e_2(v_{c_i+1}) + 1$ , breaking ties according to rule I.  $\Box$ Recall that recovering a chain of  $c_i$  deleted nodes exactly required  $c_i$  bits
- in the path compressed tree representation. In contrast, the previous lemma allows us to get away with  $\lg(c_i + 1)$  bits: an exponential improvement. Using the above lemma, we get the following upper bound for the NNLV problem (note that, on its own, it does not allow queries to be performed efficiently).

**Lemma 4.** The solutions to all nearest larger value queries can be encoded using no more than 1.89997 + o(n) bits of space.

*Proof.* We store the path compressed version of T, the Cartesian tree of A. However, we replace index Z, by an index Z' consisting of  $\lceil \lg \prod_{i=1}^{m} (c_i + 1) \rceil$ bits. Z' represents, for each deleted chain—including those that contain nodes representing A[1] and A[n]—the length of its deleted prefix. We explicitly store

the answers to nearest larger value queries for A[1] and A[n]. 255

For the remaining A[i],  $i \in [2, n-1]$  there are two options:

- 1. A[i] is represented by a node in a deleted chain from the Cartesian tree T. By Lemma 3 the replacement index Z' is enough information to recover the nearest larger values for all deleted nodes, with the exception of those in chains containing the nodes representing A[1] or A[n]. For such a chain  $C_i$ , the information recorded in Z' indicates a number  $\Delta \in \{0, ..., c_i + 1\}$ . Suppose the chain  $v_1, ..., v_{\ell+1}$  contains a node *u* representing A[1]. If *u* is in the deleted prefix, then u represents the largest element in the deleted prefix, so the only information lost by storing  $\Delta$  is the nearest larger value of A[1]. If u is in the deleted suffix, then it represents the smallest element in the deleted suffix, and the nearest larger value can be inferred. The case where a node in the chain represents A[n] is symmetric. Since we store the nearest larger values of A[1] and A[n] explicitly, we can therefore recover the nearest larger value of all deleted nodes.
- 2. A[i] is represented by a node u in the Cartesian tree T'. In this case, 270 can infer the nearest larger value as follows. Let  $s_{\ell}$  be the size of the  $T(\operatorname{left}(u))$ , which is equal to the  $T'(\operatorname{left}(u))$  plus the lengths of the chains deleted from T'(left(u)),  $s_r$  is defined analogously for right(u). Then the nearest larger value is either  $A[i - s_{\ell} - 1]$  or  $A[i + s_r - 1]$ , depending on which is closer. Ties can be broken according to rule I. 275

The space bound for storing the data structures described is  $n' + \lg \binom{n'}{m} +$  $\lg\binom{k}{m} + \lg\prod_{i=1}^{m}(c_i+1) + O(\lg n)$  bits. This is bounded by  $n' + \lg\binom{n'}{m} + \lg\binom{k}{m} + \lg\binom{k}{m}$  $m \lg(\frac{k}{m}+1)+O(\lg n)$  bits using Jensen's inequality. Numerical methods (see Appendix A) reveal that this expression is upper bounded by  $1.91975n + \Theta(\lg n)$ bits. In the sequel we show how to improve this bound. The main idea is to replace the representation of the lengths of the chains, the data structure L, with a slightly more space efficient structure.

Since there are m chains, let  $\sigma$  denote the number of distinct chain sizes. We consider the sequence  $\mathcal{R} = \{c_1, c_2, ..., c_m\}$ , letting  $m_j$  denote the number of

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occurrences of symbol j in  $\mathcal{R}$ . Given such a sequence we use  $H(\mathcal{R})$  to denote the zeroth-order empirical entropy of the sequence  $\mathcal{R}$ .<sup>4</sup> Thus, we need only store:

$$\sigma\lceil \lg n\rceil + nH(\mathcal{R}) + O(1) =$$
  
$$\sigma\lceil \lg n\rceil + \sum_{i=1}^{\sigma} \left(m_i \lg \frac{m}{m_i}\right) + O(1) \text{ bits}$$

in order to reconstruct each  $c_1, ..., c_m$ .

We can also rewrite the term  $\lg \prod_{i=1}^{m} (c_i + 1)$  to get

$$\lg \prod_{i=1}^{\sigma} (i+1)^{m_i} = \sum_{i=1}^{\sigma} m_i \lg(i+1)$$

Combining the two sums, this gives us that the total space bound is:

$$n' + \lg \binom{n'}{m} + \sum_{i=1}^{\sigma} \left( m_i \lg \frac{m(i+1)}{m_i} \right) + \sigma \lceil \lg n \rceil + O(\lg n) < n' + \lg \binom{n'}{m} + \sum_{i=1}^{\sigma} \left( m_i \lg \frac{m(i+1)}{m_i} \right) + O(\sqrt{n} \lg n)$$

bits, since the number of distinct chain lengths can be at most  $\Theta(\sqrt{n})$ . We can then rewrite the equation, recalling n' = n - k,  $k = \sum_{i=1}^{\sigma} (im_i)$ , and letting  $y_i = m_i/n$ , and Y = k/n, and  $y = \sum_{i=1}^{\sigma} (y_i)$ , to get:

$$n - k + \lg \binom{n-k}{m} + \sum_{i=1}^{\sigma} \left( m_i \lg \frac{m(i+1)}{m_i} \right) + O(\sqrt{n} \lg n) < n \left( (1-Y) \left( 1 + H\left(\frac{y}{1-Y}\right) \right) + \sum_{i=1}^{\sigma} \left( y_i \lg \frac{y(i+1)}{y_i} \right) + o(1) \right)$$

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By numerical methods (see Appendix A), we find that this expression is upper bounded by 1.89997n + o(n); a slight improvement.

### 5. Forbidden Patterns

In this section we describe a simpler approach to upper-bounding the number of distinguishable configurations of the NNLV problem, based on forbidden

<sup>&</sup>lt;sup>4</sup>Overloading notation, if x is a probability instead of a sequence of symbols, we use H(x) to denote the standard binary entropy of x:  $x \lg(\frac{1}{x}) + (1-x) \lg(\frac{1}{1-x})$ .

- patterns. As described in the previous section, the aim is, given an input array A, to come up with a new array  $A_0$ , such that using the Cartesian tree  $T_0$  of  $A_0$  to compute NNLVs using the above approach will give the same answer as for A. Our goal is to ensure that this new Cartesian tree  $T_0$  will be more compressible. The general approach is to consider the encodings of the modified
- <sup>295</sup> Cartesian trees as strings over an alphabet, then argue that certain substrings are forbidden in these encodings, and count the number of strings that exclude these substrings to upper-bound the number of modified Cartesian trees.
  - 5.1. Forbidding Zig-Zags
- Say that a degree 1 node is an *turn* if it is the right child of its parent, and it has a left child, or it is the left child of its parent and it has a right child (we take the root as being the left child of an imaginary super-root). It is a *non-turn* otherwise. Consider the encoding of a node of a binary tree where a turn is encoded as b = 01, a non-turn is encoded using c = 10 and degree 2 nodes and leaves are encoded d = 11 and a = 00 respectively. For any binary tree T, let  $\mathcal{E}(T)$  be the sequence of symbols that give the encoding of the nodes
- of the T, visiting the nodes of T in depth-first order. Overloading notation, for any array A containing distinct items, we use  $\mathcal{E}(A)$  to denote  $\mathcal{E}(T)$  where T is the Cartesian tree of A. We now claim:

**Lemma 5.** Given any array A of size n, if  $\mathcal{E}(A)$  has a subsequence of the form  $bc^{k}b$  for some  $k \geq 0$ , then there is an array  $A_{0}$  such that in  $\mathcal{E}(A_{0})$ , the above subsequence is replaced by  $cbc^{k}$ , such that all NNLV queries on A and  $A_{0}$  return the same answer, except possibly for NNLV(1) and NNLV(n).

Proof. We first consider the case where the indices in A representing the given subsequence are  $1 > i_1, \ldots, i_{k+2} > n$ . Assume without loss of generality that the node corresponding to  $i_1$  has only a right child and let  $i_0$  be the parent of  $i_1$  ( $i_0$  always exists, since  $i_1$  cannot be the root: the root cannot be a degree 1 node unless it is at position 1 or n). We make the following observations (see Figure 2):

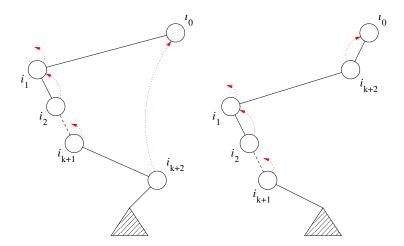


Figure 2: Diagrammatic representation of Lemma 5.

1.  $i_1, \ldots, i_{k+1}$  have only a right child (since  $i_2, \ldots, i_{k+1}$  are non-turn nodes).

- $_{320}$  2.  $i_{k+2}$  has only a left child.
  - 3. i<sub>j+1</sub> = i<sub>j</sub> + 1 for j = 1,...,k.
     4. i<sub>0</sub> = i<sub>k+1</sub> + 1.

5. 
$$i_k < i_{k+1} - 1$$
.

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Clearly,  $A[i_j] > A[i_{j+1}]$  for  $j = 0, \ldots, k$ . Thus, we have:

6. NNLV
$$(A, i_j) = i_{j-1}$$
 for  $j = 2, \dots, k+1$   
7. NNLV $(A, i_1) = i_1 - 1$ , since  $i_0 - i_1 \ge 3$ .

8. NNLV $(A, i_{k+2}) = i_0$ , since  $i_{k+2} - i_{k+1} > 1$ .

Thus, we can create a new array  $A_0$  such that  $A[i_1] < A_0[i_{k+2}] < A[i_0]$  and  $A[j] = A_0[j]$  for all  $j \neq i_{k+2}$ . It is easy to verify that all NNLV answers in  $A_0$  are the same as in A.

Now suppose that  $i_1$  is the root of the Cartesian tree. For it to be a turn, it must be the case that  $i_1$  only has a right child (recall that the root is the left child of its imaginary parent). Then  $i_1 = 1$ , and furthermore,  $i_{k+2} = n$ . In  $A_0$ , the only NNLV answers that change will be for 1 and n. A similar argument

shows that if  $i_1$  is not the root of the Cartesian tree and it is the left (right) child of its parent  $i_0$  then  $i_1 = 1$  ( $i_1 = n$ ) is the only possibility not yet considered; in this case NNLV(1) (NNLV(n)) is the only answer that changes.

### 5.2. Forbidding a Turn Before a Leaf

**Lemma 6.** Given an array A of size n, if  $\mathcal{E}(A)$  has a subsequence of the form <sup>340</sup> ba, then there is an array  $A_0$  such that in  $\mathcal{E}(A_0)$ , the above subsequence is replaced by ca, such that all NNLV queries, except possibly on positions 1 and non  $A_0$  return a correct answer for A, using Rule III for tiebreaking (break ties to larger).

**Proof.** First consider the case that the nodes labelled b and a correspond to the indices 1 < i and i + 1 < n. In this case, we have the following observations.

• The parent of i must be i + 2.

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- i+1 has two equidistant larger values, i and i+2, and NNLV(A, i+1) = i+2since A[i+2] > A[i].
- Observe that i − 1 must be an ancestor of i meaning A[i − 1] > A[i], and hence NNLV(A, i) = i − 1.

In  $A_0$ , we exchange the values A[i] and A[i+1]. Now NNLV $(A_0, i+1) = i+2$ as before.  $A_0[i]$  now has two equidistant larger values, i-1 and i+1, since  $A_0[i-1] = A[i-1] > A[i] = A_0[i+1]$ , so NNLV $(A_0, i) = i-1$  as before.

The case that b is i + 1 < n and a is i > 1 is symmetric. Finally, it can be verified that if i or i + 1 is one of the boundary elements A[1] or A[n], the only possibilities where NNLV $(i, A_0) \neq$  NNLV(i, A) are the cases i = 1 or i = n.

### 5.3. Counting Strings with Forbidden Sub-Patterns

Overview. We apply the transformations on A repeatedly until the patterns ba and  $bc^*b$  do not exist. We upper-bound the number of distinct modified Cartesian trees by the number of distinct strings over the alphabet  $\{a, b, c, d\}$ 

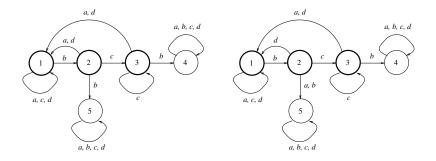


Figure 3: Automata for all strings over  $\{a, b, c, d\}$  excluding  $bc^*b$  (left), and both  $bc^*b$  and ba (right). The initial state is 1 and the final states are 1, 2, and 3 in each case.

that exclude just the pattern  $bc^*b$  and that exclude both  $bc^*b$  and ba. To count the number of strings with forbidden sub-patterns, we use the *transfer matrix* approach [12]. In this approach, we first create a DFA with states  $s_1, \ldots, s_k$ that accepts exactly those strings which do not have any forbidden substrings (assume wlog that  $s_1$  is the start state). We then create the transfer matrix M, which is a  $k \times k$  matrix where the (i, j)-th entry is the number of distinct symbols that label a transition from  $s_i$  to  $s_j$ . It is not hard to see that the

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symbols that laber a transition noise  $s_i$  to  $s_j$ . It is not hard to see that the (i, j)-th entry of  $\sum_{i=0}^{\infty} (Mz)^i = (I - Mz)^{-1}$ , where z is a formal variable, is the generating function for the number of distinct strings that lead from  $s_i$  to  $s_j$ . Summing up the (1, j)-th entries of  $(I - Mz)^{-1}$  for all final states j gives the required generating function.

In our case, the generating functions will be *rational* functions of the form P(z)/Q(z) where P and Q are polynomials. To obtain asymptotic upper bounds on the coefficient of  $z^n$  we use the following:

Theorem 4 (Rational Expansion Theorem[12]). If R(z) = P(z)/Q(z) is the generating function for the sequence  $\langle r_n \rangle$ , where  $Q(z) = (1 - \rho_1 z)(1 - \rho_2 z) \dots (1 - \rho_\ell z)$ , and the numbers  $(\rho_1, \dots, \rho_\ell)$  are distinct, and if P(z) is a polynomial of degree less than  $\ell$ , then  $r_n = \sum_{i=1}^{\ell} a_i \rho_i^n$  for constants  $a_1, \dots, a_\ell$ . Results. Let  $f_n(g_n)$  for  $n \ge 1$  denote the number of distinct strings of length n over the alphabet  $\{a, b, c, d\}$  that exclude just the pattern  $bc^*b$  (exclude both  $bc^*b$  and ba, respectively). The automata that accept all strings over  $\{a, b, c, d\}$  excluding  $bc^*b$ , and both  $bc^*b$  and ba are shown in Figure 3. The corresponding transfer matrices are below:

$$M_{1} = \begin{pmatrix} 3 & 1 & 0 & 0 & 0 \\ 2 & 0 & 1 & 0 & 1 \\ 2 & 0 & 1 & 1 & 0 \\ 0 & 0 & 0 & 4 & 0 \\ 0 & 0 & 0 & 0 & 4 \end{pmatrix}, \quad M_{2} = \begin{pmatrix} 3 & 1 & 0 & 0 & 0 \\ 1 & 0 & 1 & 0 & 2 \\ 2 & 0 & 1 & 1 & 0 \\ 0 & 0 & 0 & 4 & 0 \\ 0 & 0 & 0 & 0 & 4 \end{pmatrix}$$

We obtain  $(I - M_1 z)^{-1}$  as:

$$\begin{pmatrix} \frac{1-z}{z^2-4z+1} & \frac{-(z-1)z}{z^2-4z+1} & \frac{z^2}{z^2-4z+1} & \frac{z^3}{-4z^3+17z^2-8z+1} & \frac{(z-1)z^2}{(4z-1)(z^2-4z+1)} \\ \frac{2z}{z^2-4z+1} & \frac{3z^2-4z+1}{z^2-4z+1} & \frac{z-3z^2}{z^2-4z+1} & \frac{z^2(3z-1)}{(4z-1)(z^2-4z+1)} & \frac{z(3z^2-4z+1)}{-4z^3+17z^2-8z+1} \\ \frac{2z}{z^2-4z+1} & \frac{2z^2}{z^2-4z+1} & \frac{-2z^2-3z+1}{z^2-4z+1} & \frac{z(2z^2+3z-1)}{(4z-1)(z^2-4z+1)} & \frac{2z^3}{-4z^3+17z^2-8z+1} \\ 0 & 0 & 0 & \frac{1}{1-4z} & 0 \\ 0 & 0 & 0 & 0 & \frac{1}{1-4z} & 0 \\ \end{pmatrix}$$

Adding together the entries in positions (1,1), (1,2), and (1,3) we get that  $F(z) = \frac{1-z-(z-1)z+z^2}{z^2-4z+1} = \frac{1}{z^2-4z+1}$  is the generating function for  $\langle f_n \rangle$ . The roots of  $z^2 - 4z + 1$  are  $2 + \sqrt{3}$  and  $2 - \sqrt{3}$  giving  $\rho_1 = 1/(2 + \sqrt{3}) < 0.27695$  and  $\rho_2 = 1/(2 - \sqrt{3}) < 3.73206$ . From this we use Theorem 4 to conclude that  $\lg f_n = n \lg 3.73206 + o(n) = 1.89997n + o(n)$ .

We remark that the constant achieved via the above calculation is strikingly similar to that of Lemma 4. We have been unable to determine whether the bounds achieved by the two approaches are indeed equal, or just matching up to five decimal places. Similarly  $(I - M_2 z)^{-1}$  equals:

$$\begin{pmatrix} \frac{z-1}{z^3-2z^2+4z-1} & \frac{(z-1)z}{z^3-2z^2+4z-1} & \frac{z^2}{-z^3+2z^2-4z+1} & \frac{z^3}{4z^4-9z^3+18z^2-8z+1} & \frac{-2(z-1)z^2}{(4z-1)(z^3-2z^2+4z-1)} \\ \frac{-z(z+1)}{z^3-2z^2+4z-1} & \frac{-3z^2+4z-1}{z^3-2z^2+4z-1} & \frac{z(3z-1)}{z^3-2z^2+4z-1} & \frac{z^2-3z^3}{4z^4-9z^3+18z^2-8z+1} & \frac{2z(3z^2-4z+1)}{(4z-1)(z^3-2z^2+4z-1)} \\ \frac{-2z}{z^3-2z^2+4z-1} & \frac{-2z^2}{z^3-2z^2+4z-1} & \frac{z^2+3z-1}{z^3-2z^2+4z-1} & \frac{-z(z^2+3z-1)}{(4z-1)(z^3-2z^2+4z-1)} & \frac{4z^3}{4z^4-9z^3+18z^2-8z+1} \\ 0 & 0 & 0 & \frac{1}{1-4z} & 0 \\ 0 & 0 & 0 & 0 & \frac{1}{1-4z} & 0 \\ \end{pmatrix}$$

From which we get that  $G(z) = \frac{z-1+(z-1)z+z^2}{z^3-2z^2+4z-1} = \frac{-1}{z^3-2z^2+4z-1}$ . Solving for  $z^3 - 2z^2 + 4z - 1 = 0$  we get that  $\rho_1 < 3.51155$ , and that  $\rho_2$  and  $\rho_3$ , both of which are complex, have magnitude < 0.53365. From this we use Theorem 4 to conclude that  $\lg g_n = n \lg 3.51155 + o(n) = 1.81211n + o(n)$ .

### 6. Data Structures

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To accomplish the goal of supporting operations, we use a technical modification of the mini-micro tree decomposition presented by Farzan and Munro [10] <sup>395</sup> which can be stated as follows:

**Lemma 7 (Theorem 1 [10]).** For any parameter k > 1, a tree with n nodes can be decomposed into  $\Theta(\frac{n}{k})$  subtrees of size at most 2k, which are pairwise disjoint aside from their roots. With the exception of edges branching from the root of a subtree, there is at most one edge from a non-root node in a subtree to a node outside the subtree.

We also make use of the succinct binary tree data structure of Davoodi et al. [4] that supports the following operations in O(1) time, and represents an arbitrary binary tree using 2n + o(n) bits:

1.  $select_inorder(T, i)$ : return the node u in T having inorder number i.

2. subtree\_size(T,u): Return the size of the subtree rooted at node u in T.

3. parent(T, u): Return the parent node of u in T.

**Algorithm 1** Computing NNLV(A, i).

```
1: if i = 1 or i = n then
        return explicitly stored answer for A[1] or A[n].
 2:
 3: else
        \ell \leftarrow \texttt{subtree\_size}(\texttt{left}(\texttt{select\_inorder}(i)))
 4:
        r \leftarrow \texttt{subtree\_size}(\texttt{right}(\texttt{select\_inorder}(i)))
 5:
 6:
        if \ell < r and i - \ell - 1 \ge 1 then
            return i - \ell - 1
 7:
        else if i + r + 1 \le n then
 8:
            return i + r + 1
 9:
        else
10:
            return -1 (A[i] is the maximum, and has no NNLV)
11:
        end if
12:
13: end if
```

4. left(T, u) (resp. right(T, u)): return node u's left (resp. right) child in T.

We are now ready to prove Theorem 2. We note that the same machinery 410 can be applied to prove Theorem 1, almost verbatim, except we replace the forbidden pattern representation with that of Lemma 4.

*Proof.* Given the array A, we obtain an array  $A_0$  as described in Sections 5.1 and 5.2. We create the Cartesian tree  $T_0$  of  $A_0$ , and seek to represent  $T_0$  in 1.81211n + o(n) bits so that NNLV queries can be answered in O(1) time.

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We now present a straightforward modification of the succinct binary tree representation of Davoodi et al. [4]. The representation of Davoodi et al. applies Lemma 7 to decompose the tree into O(n/\lg n) micro-trees of with at most \lceil \frac{\lg n}{k} \rceil nodes, for some constant k \ge 8. Apart from the space needed to represent the micro-trees, the space usage of their representation is o(n) bits.
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Our objective is to replace the encoding of the micro-trees with one based on Sections 5.1 and 5.2. For each micro-tree  $\mu$  of  $\nu$  nodes, we create  $\mathcal{E}(\mu)$  as a string of length  $\nu$  over the alphabet  $\{a, b, c, d\}$  as above. Observe that patterns that are forbidden in  $\mathcal{E}(T_0)$  are also (essentially) forbidden in  $\mathcal{E}(\mu)$ . The only exception is that a degree 1 or 2 node v in  $\mu$  may have its children in another

- <sup>425</sup> micro-tree. Then v is a leaf of  $\mu$ , and if its parent is a degree 1 turn node, then a forbidden pattern may appear in  $\mathcal{E}(\mu)$ . However, this can happen only for nodes which have their children in another micro-tree, and there is at most one such node by Lemma 7. The information needed to store the modifications to  $\mathcal{E}(\mu)$  so that  $\mathcal{E}(\mu)$  now has no forbidden patterns takes at most  $O(\lg \nu) = O(\lg \lg n)$  bits,
- which is negligible summed over all micro-trees since the number of micro-trees is  $O(n/\lg n)$ .

The representation of  $\mathcal{E}(\mu)$  is as a pointer into a table that stores all possible trees whose encodings have no forbidden patterns; this pointer clearly takes  $1.81211 \cdot \nu + O(1)$  bits. The representations of all micro-trees take  $1.81211 \cdot n + O(n/\lg n)$  bits. Since the encoding of each micro-tree takes at most  $(\lg n)/4 + O(1)$  bits, operations on nodes inside a micro-tree can be done in O(1) time by table-lookup, as in [4]. Finally, the algorithm to answer the NNLV query is presented in Algorithm 1, and uses only operations supported by the representation of Davoodi et al. [4].

### 440 7. Exact Enumeration of Distinguishable Configurations

In this section we count the distinguishable configurations with respect to NNLV queries. We obtain recursive formulae for the precise numbers of distinguishable configurations. The values calculated by these formulae will also improve the lower bound as indicated in Theorem 3.

- In total we define six sequences. Of these,  $\Gamma$  is the sequence that counts the number of distinguishable configurations of the NNLV problem; the others are auxiliary sequences. We will use the notation of a *chain of nearest neighbours* for a list of numbers  $L_1, \ldots, L_n$  where the nearest neighbour of  $L_i$  is  $L_{i+1}$ . Further, we use the term *distinguishable configurations of*  $A[l \ldots r]$  for some
- 450 l, r when configurations can be distinguished by asking the queries NNLV(i) for  $i = l, \ldots, r$ .

- 1.  $\mathcal{A} = \{\alpha_n\}_{n \in \mathbb{N}}$ . Let  $A[0 \dots n+1]$  be an array of n+2 numbers such that A[0] and A[n+1] are greater than A[i] for all  $1 \leq i \leq n$ . Then  $\alpha_n$  is the number of distinguishable configurations of  $A[1 \dots n]$ . Figure 7 (first row) denotes the conditions for  $\mathcal{A}$  graphically.
- 2.  $\mathcal{B} = {\{\beta_n\}_{n \in \mathbb{N}}}$ . Let  $A[0 \dots n]$  be an array of n + 1 numbers such that A[0] > A[i] for all  $1 \le i \le n$ . Then  $\beta_n$  is the number of distinguishable configurations of  $A[1 \dots n]$ . Figure 7 (second row) denotes the conditions for  $\mathcal{B}$  graphically.
- 3.  $\mathcal{B}^{\text{rev}} = \{\beta_n^{\text{rev}}\}_{n \in \mathbb{N}}$ . Let  $A[1 \dots n+1]$  be an array of n+1 numbers such that A[n+1] > A[i] for all  $1 \leq i \leq n$ . Then  $\beta_n^{\text{rev}}$  is the number of distinguishable configurations of  $A[1 \dots n]$ .
  - 4.  $\Gamma = {\gamma_n}_{n \in \mathbb{N}}$ . Let  $A[1 \dots n]$  be an array of *n* numbers. Then  $\beta_n$  is the number of distinguishable configurations of  $A[1 \dots n]$ . Figure 7 (third row) denotes the conditions for  $\Gamma$  graphically.
  - 5.  $\Delta = \{\delta_{n,m}\}_{n,m\in\mathbb{N}}$ . Let A[0...n + m + 1] be an array of n + m + 2numbers such that A[0] > A[i] for all  $1 \le i \le n$ ; A[n + m + 1] > A[i]for all  $1 \le i \le n + m$ ; A[n] > A[i] for all  $n + 1 \le i \le n + m$ ; and there exists a chain of nearest neighbours from A[n] to A[0] without including A[n+m+1]. Then  $\delta_{n,m}$  is the number of distinguishable configurations of A[1...n]. Figure 7 (fourth row) denotes the conditions for  $\Delta$  graphically.
  - 6.  $\Delta^{\text{rev}} = \{\delta_{n,m}^{\text{rev}}\}_{n,m\in\mathbb{N}}$ . Let  $A[-m\dots n+1]$  be an array of n+m+2numbers such that A[n+1] > A[i] for all  $1 \le i \le n$ ; A[-m] > A[i] for all  $-m+1 \le i \le n$ ; A[1] > A[i] for all  $-m+1 \le i \le 0$ ; and there exists a chain of nearest neighbours from A[1] to A[-m] without including A[n+1]. Then  $\delta_{n,m}^{\text{rev}}$  is the number of distinguishable configurations of  $A[1\dots n]$ .

All sequences share that they count the number of distinguishable configurations of A[1...n]. In the special case of n = 0 the array A[1...n] is of length

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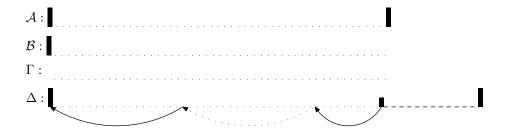


Figure 4: Overview of conditions for each sequence

zero. No queries can be made that distinguishes between any two configurations. Hence the number of distinguishable configurations is 1 and in particular  $\alpha_0 = \beta_0 = \beta_0^{\text{rev}} = \delta_{0,m} = \delta_{0,m}^{\text{rev}} = 1$  for  $m \in \mathbb{N}$ .

We first prove some auxiliary lemmas.

**Lemma 8.** Let A[0...n+1] be an array of n+2 numbers such that A[0] > A[i]for all  $1 \le i < (n+1)/2$  and A[n+1] > A[j] for all  $1 \le j \le n$ . Then  $\alpha_n$  is the number of distinguishable configurations of A[1...n].

*Proof.* Any array of n+2 numbers that satisfy the condition for sequence  $\mathcal{A}$  also satisfies the condition of this lemma. Hence there are at least  $\alpha_n$  distinguishable configurations of A[1...n] where A satisfies the condition of this lemma. Lets assume there exist an array  $A[0 \dots n+1]$  of n+2 numbers that satisfies the condition of this lemma and its configuration of A[1...n] is dis-490 tinguishable from all conditions of  $\overline{A}[1...n]$  within an array  $\overline{A}$  that satisfy the condition of sequence  $\mathcal{A}$ . We now consider the array  $A'[0 \dots n+1]$  defined by A'[i]=A[i] for all  $1\leq i\leq n+1$  and A'[0]=A[n+1]+1. So A' satisfies the condition of sequence  $\mathcal{A}$  and A' configuration of  $A'[1 \dots n]$  must distinguishable A's configuration of A[1...n]. As both arrays are the same apart from A'[0] > A[0]495 there must exists an  $1 \leq j \leq n$  which nearest neighbour in A' is A[0] and in A it is not A[0]. So A[0] < A[j] < A'[0]. Since A satisfies the condition of this lemma  $j \ge (n+1)/2$ . This is contradiction as any such position is not closer to A'[0] than to A'[n+1], in A'[j] nearest neighbour cannot be A'[0]. Hence by

weakening the condition of sequence  $\mathcal{A}$  to the condition of this lemma does not



Figure 5:  $\beta_n$  sequence step

create further distinguishable configuration on A[1...n].

A similar approach will give following lemma.

**Lemma 9.** Let A[0...n+1] be an array of n+2 numbers such that A[0] > A[i]for all  $1 \le i \le n$  and A[n+1] > A[j] for all  $(n+1)/2 \le j \le n$ . Then  $\alpha_n$  is the number of distinguishable configurations of A[1...n].

Now we give the formulae for each sequence.

# Lemma 10. $\beta_n = \sum_{i=1}^n \alpha_{i-1} \beta_i n - i$

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Proof. Let A[0...n] be an array satisfying the condition of sequence  $\mathcal{B}$ . Further let A[i] be the highest number in A[1...n]. Then A[0] has no nearest neighbour in A. The nearest neighbour of A[i] is A[0]. The nearest neighbours of A[1] to A[i-1] must lie within the subarray A[0...i] which also satisfies the condition sequence  $\mathcal{A}$ . Similarly the the nearest neighbours of A[i+1] to A[n]must lie with the subarray A[i...n], which satisfies the condition of sequence  $\mathcal{B}$ . Hence, the number of distinguishable configuration of A[1...n] is  $\alpha_{i-1}\beta_{n-i}$ .

For any  $1 \leq i \leq n$ , A[i]'s nearest neighbour is A[0] and there does not exists a number A[j] with j > i such that A[j]'s nearest neighbour is A[0]. Hence all configurations for one value of i are distinguishable from configurations of different value of i.

Summing up all distinguishable configuration for all possible values of i gives the above formula of  $\beta_n$ .

Following the structure of the proof of Lemma 10 one can show that  $\beta_n^{\text{rev}} = \sum_{i=1}^n \beta_{i-1}^{\text{rev}} \alpha n - i = \sum_{i=1}^n \alpha_{i-1} \beta_{n-i}^{\text{rev}}$ . Since  $\beta_0^{\text{rev}} = 1 = \mathcal{B}_0^{\text{rev}}$  we have the following lemma.



### Figure 6: $\gamma_n$ sequence step

525 **Lemma 11.**  $\beta_n^{rev} = \beta_n$  for all  $n \in \mathbb{N}$ .

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# Lemma 12. $\gamma_n = \sum_{i=1}^n \beta_{i-1} \beta_{n-i}$

Proof. Let A[1...n] be an array of n numbers. Further let A[i] be the highest number in A. Then A[i] has no nearest neighbour in A; the nearest neighbours of A[1] to A[i-1] lie in the subarray A[1...i-1] which satisfy the condition of B'; the nearest neighbours of A[i+1] to A[n] lie in the subarray A[1...n] which satisfies the condition of B. See figure 7.

Hence the number of distinguishable configurations of  $A[1 \dots n]$  is  $\beta_{i-1}\beta_{n-i}$ . For any  $1 \leq i \leq n$ , A[0] is the only number that has no nearest neighbour in A. Hence all configurations for one value of i are distinguishable from configurations of different value of i. Summing up all distinguishable configuration for all possible values of i gives the above formula of  $\gamma_n$ .

**Lemma 13.**  $\delta_{n,m} = \sum_{i=1}^{\min(m,n)} \alpha_{i-1} \delta_{(n-i,i+m)}$ 

Proof. As given by the conditions of the sequence  $\Delta$  there exists a chain of nearest neighbours from A[n] to A[0]. So let *i* be the distance of the A[n] to its nearest neighbour. Then there exists a chain of nearest neighbours from A[n-i]to A[0], A[n-i] is greater than any number between A[n-i+1] to A[n+m], and also A[n+m+1] remain higher than all number in  $A[1 \dots n]$ . Hence there are  $\delta_{n-i,m+i}$  distinguishable configuration for A[1] to A[n-i]. The subarray  $A[n-i+1 \dots n$  satisfy the condition of  $\mathcal{A}$ . So every *i* there are  $\alpha_{i-1}\delta_{n-i,i+m}$ distinguishable configurations. Building the sum of over all possible values of *i* give the formula of  $\delta_{n,m}$ .

Following the same structure as used in the proof of Lemma 13 one can show that  $\delta_{n,m}^{\text{rev}} = \sum_{i=1}^{\min(m-1,n)} \alpha_{i-1} \delta_{(n-i,i+m)}^{\text{rev}}$ . Since  $\delta_{0,m}^{\text{rev}} = 1 = \Delta_{0,m}^{\text{rev}}$  for all  $m \in \mathbb{N}$ we have the following lemma. **Lemma 14.**  $\delta_{n,m}^{rev} = \delta_{n,m-1}^{rev}$  for all  $n, m \in \mathbb{N}$ .

**Lemma 15.** Let  $r = \lfloor \frac{2n+1}{3} + 1 \rfloor$  and  $l = \lfloor \frac{r}{2} \rfloor$  then

$$\begin{aligned} \alpha_n &= \sum_{k=l}^{i-1} \alpha_{k-1} \alpha_{n-k} + \\ &\sum_{i=1}^{l-1} \sum_{j=r}^{n} \alpha_{i-1} \alpha_{j-i-1} \alpha_{n-j} + \\ &\sum_{i=1}^{l-1} \sum_{j=r}^{n} \sum_{k=2i+1}^{i+\left\lfloor \frac{j-i+1}{2} \right\rfloor - 1} \sum_{p=2k-i+1}^{\min(j,2k)} \alpha_{i-1} \alpha_{n-j} \alpha_{k-i-1} \alpha_{p-k-1} \delta_{j-p,p} + \\ &\sum_{i=1}^{l-1} \sum_{j=r}^{n} \sum_{k=i+\left\lfloor \frac{j-i+1}{2} \right\rfloor}^{2j-1-n} \sum_{p=\max(i,2k-n)}^{2k-j} \alpha_{i-1} \alpha_{n-j} \alpha_{j-k-1} \alpha_{k-p-1} \delta_{p-i,n-p} - \\ &\sum_{j=r}^{n} \alpha_{n-j} \delta_{j-1,1} \end{aligned}$$

Proof. The setting of  $\alpha_n$  splits into five disjoint cases, see Figure 7. Each of them corresponds to a line in the formula of  $\alpha_n$ . We use *i* for the rightmost position that has A[0] as its nearest neighbour and *j* for the leftmost position that has A[n+1] as its nearest neighbour. As we break ties to the right, *j* must always exists but *i* must not. Further we split A[1...n] in three roughly evenly sized parts: First third A[1...l-1], the middle third A[l...r-1] and the last third A[r...n] with  $r = \lfloor \frac{2n+1}{3} + 1 \rfloor$  and  $l = \lfloor \frac{r}{2} \rfloor$ .

We first identify three cases that cover all configurations and do not share any configurations. We later split case 2 into three separate sub-case and reach our five cases as given in the formula.

- Case 1: Either i or j lies in middle third.
- Case 2: The position i lies in the first third and j lies in the last third.
- Case 3: The position j in the last third and i does not exists.

From the definitions the cases have disjoint configurations. To show all configuration are covered by the three cases one has to show that there are no configurations with *i* in last third or *j* in the first third. As the nearest neighbour of A[i] is A[0] it must be strictly closer to A[0] than to A[n+1] as both of them are higher than A[i] and we break ties to the right. As  $r = \lfloor \frac{2n+1}{3} + 1 \rfloor \ge \frac{2n+1+1}{3} > \frac{n+1}{2} \ge \lfloor n+1 \rfloor 2$  any position in the last third cannot have A[0] as its nearest neighbour. Similarly for the first third, as  $l-1 = \lfloor r \rfloor 2 - 1 < \frac{2n+1+3}{6} = \frac{n}{3} + \frac{1}{2} \le \frac{n+1}{2}$  a number in the first third cannot have A[n+1] as its nearest neighbour.

We will now go through each case and justify the corresponding part in the formula of  $\alpha_n$ .

**Case 1.** We first assume A[i] lies in the middle third. Note that this does not mean A[i] is highest number among  $A[1 \dots n]$ , but it is higher than any A[1]to A[i-1]. Also it is higher than any A[i+1] to A[i+i]. If one shows that i+i is at least  $\lfloor (n+1+i)/2 \rfloor - 1$  by Lemma 8 the number of distinguishable configuration will be  $\alpha_{i-1}\alpha_{n-i}$ . So

$$i+i \ge |(n+1+i)/2| - 1$$

$$\begin{array}{c} \Leftarrow 3i \geq n \\ \Leftrightarrow 3\left\lfloor \frac{r}{2} \right\rfloor \geq \frac{3r-3}{2} \geq \frac{3\left(\left\lfloor \frac{2n+1}{3}+1 \right\rfloor\right)-3}{2} \leq \frac{2n+1+3-3}{2} > n+\frac{1}{2} \end{array}$$

5	7	5

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If we assume A[j] lies in the middle third, by a similar argument and by the Lemma 8 the number of distinguishable configuration is  $\alpha_{j-1}\alpha_{n-j}$ .

So the number of all distinguishable configurations covered by case 1 is  $\sum_{k=l}^{r-1} \alpha_{k-1} \alpha_{n-k}.$ 

**Case 2.** So A[i] lies in the first third and A[j] lies in the last third. A[i] or A[j] must the be the highest value among A[1...n]. However the other does not have to be the second highest. We first assume that A[i] and A[j] are the highest and second highest values (case 2a). This gives  $\sum_{i=1}^{l-1} \sum_{j=r}^{n} \alpha_{i-1} \alpha_{j-i-1} \alpha_{n-j}$ distinguishable configurations.

In case 2b, we count the additional configuration to the case 2a, when A[j] is highest and A[i] is not the second highest value in among  $A[1 \dots n]$ . In order to have a configuration that has not yet been counted in case 2a there must exists an A[k] > A[i] with i < k < j such that A[k] nearest neighbour is not A[i] but it would be so if A[i] would have been the second highest. The number A[k] must lie further away from A[i] then A[i] is from A[0] as A[i]'s nearest neighbour is A[0]. Also A[k] must be closer to A[i] then to A[j]. Hence the range for k is from 2i + 1 to  $i + \lfloor \frac{j-i+1}{2} \rfloor - 1$ . In a single configuration there might multiple numbers that satisfy the condition of A[k]. To avoid double counting of configuration we assume that A[k] is the furthest left of such numbers and hence count the configuration in between A[i] and A[k] by  $\alpha_{k-i-1}$ . We now consider A[p] the nearest neighbour of A[k]. The number A[k] must be closer to A[i] than to A[p]as it other wise never has A[i] as its nearest neighbour independent of the value of A[i]. Hence  $2k - i + 1 \ge p$ . As A[p] is A[k]'s nearest neighbour, A[p] must be less or the same distance away from A[k] than A[k] is from A[0], as otherwise A[0] is A[k]'s nearest neighbour. Also it must not lie to the right of A[j]. Hence  $p \le \min(j, 2k)$ . From A[p] onwards there must be a chain of nearest neighbours to A[j]. Hence the number of configuration for case 2b are

$$\sum_{i=1}^{l-1} \sum_{j=r}^{n} \sum_{k=2i+1}^{i+\left\lfloor \frac{j-i+1}{2} \right\rfloor - 1} \sum_{p=2k-i+1}^{\min(j,2k)} \alpha_{i-1} \alpha_{n-j} \alpha_{k-i-1} \alpha_{p-k-1} \delta_{j-p,p}$$

The case 2c is equivalent to case 2b with A[i] being the highest number and A[j] not being the second highest number in  $A[1 \dots n]$ . The reasoning concerning the range for k and p are similar and lead to  $k \ge i + \lfloor \frac{j-i+1}{2} \rfloor$ ,  $j-k \ge n-j+1$ , k-p < n+1-k,  $p \ge i$  and k-p > j-k Hence all configuration of case 2c are

$$\sum_{i=1}^{l-1} \sum_{j=r}^{n} \sum_{k=i+\left\lfloor \frac{j-i+1}{2} \right\rfloor}^{2j-1-n} \sum_{p=\max(i,2k-n)}^{2k-j} \alpha_{i-1} \alpha_{n-j} \alpha_{j-k-1} \alpha_{k-p-1} \delta_{p-i,n-p}$$

**Case 3.** There is no number that has A[0] as it's nearest neighbour. So there is a chain of nearest neighbours from A[1] to A[j]. The number of configuration for  $A[1 \dots j]$  is  $\delta_{n-j,1}$  and for  $A[j+1 \dots n$  is  $\alpha_{n-j}$ . The total number of configuration of case 3 is

$$\sum_{j=r}^{n} \alpha_{n-j} \delta_{j-1,1}$$

By adding up the formulae for each case we obtain the formula for  $\alpha_n$ .

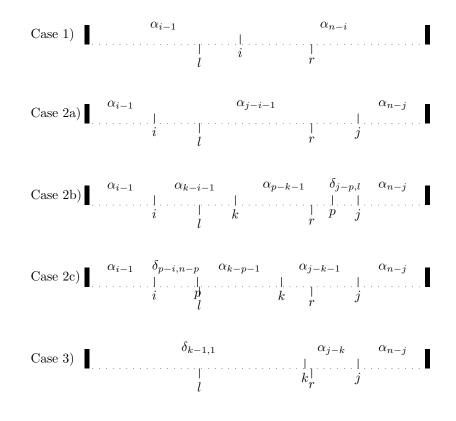


Figure 7:  $\alpha_n$  sequence step

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We were unable to give a closed-form solution for  $\gamma_n$ . We have, however, computed them up to n = 700. Figure 7 shows the ratios of  $\gamma_n/\gamma_{n-1}$  and  $\alpha_n/\alpha_{n-1}$ , and  $2_n^k$  where  $k_n$  is lower bound of bytes obtained by using the formula, as given in Section 8, with the values of  $\gamma_n$  and  $\alpha_n$ . Up to the computed values the ratios for  $\Gamma$  and  $\mathcal{A}$  are monotonic increasing.

### 8. Lower Bound

The main idea of the lower bound is to show that for a given n, there are many configurations of A that can be distinguished by NNLV queries. To do this, we reuse the sequence definitions for both  $\alpha_n$  and  $\gamma_n$  from the previous section:  $\alpha_n$  can be considered to be a *restricted input* to the NNLV problem

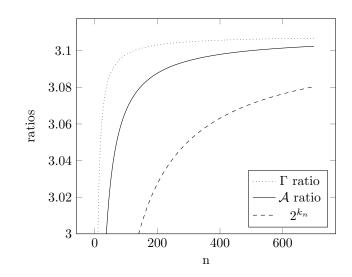


Figure 8: The ratios of consecutive values for sequence  $\Gamma$  and A, 2 to the power of the lower bound of bytes.

that is padded with two additional entries  $A[0] = \infty$  and  $A[n+1] = \infty$ .

For an *n* element array, we use  $\alpha_n$  to denote the number of different configurations for the NNLV problem on restricted inputs, and  $\gamma_n$  to denote the number of solutions to NNLV, both subject to tie breaking rule I. We present both sequences in Table 3 for some values of *n* and up to n = 700.

Next we discuss how to the values in Table 3 to derive a lower bound. Consider an array of length n, for n sufficiently large. Without loss of generality, we assume that a parameter  $\ell \geq 1$  divides n - 2 and that  $\frac{n-2}{\ell}$  is odd. Let  $D_i$ denote the *i*-th odd block, and  $E_i$  denote the *i*-th even block. Locations A[1]and A[n] are assigned values n - 1 and n, respectively. Odd block  $D_i$  is assigned values  $[(i-1)\ell + 1, i\ell]$ , and can be arranged in one of  $\alpha_\ell$  configurations, to form an instance of a restricted input. Suppose there are  $\lambda$  odd blocks. Even block  $E_i$  will be assigned values from  $[(\lambda + i - 1)\ell + 1, (\lambda + i)\ell]$ , and arranged in one of the  $\gamma_\ell$  configurations of the NNLV problem.

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Our claim is that each even (resp. odd) block can be assigned any of the  $\gamma_{\ell}$  (resp.  $\alpha_{\ell}$ ) possible configurations, without interference from other blocks. To see this, consider that for each even block we have assigned values so that—with

n	$\gamma_n$	$\alpha_n$
0	1	1
1	1	1
2	2	2
3	5	4
4	14	9
5	40	22
6	116	55
7	341	142
8	1010	378
9	3009	1015
10	9012	2768
50	$2.60634 \times 10^{23}$	$1.76356 \times 10^{22}$
200	$1.23839 \times 10^{97}$	$2.13372 \times 10^{95}$
400	$3.14284 \times 10^{195}$	$2.71590 \ \times 10^{193}$
700	$1.49191 \times 10^{343}$	$7.37685 \times 10^{340}$

Table 3: The calculated values of  $\gamma_n$  and  $\alpha_n$  for some selected values of n.

the exception of the maximum element—the nearest larger value to all elements must be within the same block. This follows since the adjacent odd blocks

contain strictly smaller values than those in any even block. Moreover, for odd blocks, the values immediately to the left and right of the block are strictly

larger than any values in the block. Thus, we can force the global solution to the NNLV problem on the entire array into at least  $(\gamma_{\ell}\alpha_{\ell})^{\frac{n-2}{2\ell}}$  distinct structures. This implies that  $\lg \gamma_n$  is at least  $\frac{(n-2)}{2\ell} \lg(\gamma_{\ell}\alpha_{\ell})$ : selecting  $\ell = 700$  yields the lower bound of Theorem 3.

### 9. Conclusions

We have introduced the encoding NNLV problem, and have noted its combinatorial richness. Using a novel path-compressed representation of Cartesian trees, we gave a space-efficient NNLV encoding that supports queries in O(1)time. Determining the effective entropy of NNLV, and to consider the other NNLV variants (such as for arrays of non-distinct values), is an open problem. Finding ways to apply NNLV encodings to compressed suffix trees, as Fischer [7] did for his bidirectional NLV encoding, would also be interesting.

We conclude with a final remark about the sub-optimality of our approaches for representing an NNLV tree. To show that these data structures are suboptimal, consider the following two example arrays:

[10, 12, 8, 9, 1, 7, 3, 4, 2, 6, 5, 13, 11] and [10, 12, 7, 9, 1, 6, 3, 4, 2, 8, 5, 13, 11]

Both of these arrays have *different* cartesian trees which contain no degree one <sup>630</sup> nodes, however they both have the same NNLV tree under the three tie-breaking rules. This indicates that any strategy which focuses only on degree one nodes in the Cartesian tree is unlikely to achieve optimal bounds, whatever they may be.

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### Appendix A. Mathematica Code

In this section we present Mathematica code for numerical maximization that leads to the bounds presented in Lemma 4. The following snippet produces first bound discussed in the Lemma:

The second bound is slightly more involved, and involves optimizing over a vector to determine the values of  $y_i$  that maximize the entropy of the chains. Through experimentation, we determined that  $y_i = 0$  for all i > 15 (hence setting  $\sigma = 15$  below).

```
Sigma = 15;
g[m_,k_]:=
1-(Sum[m[[i]]*i, {i,1,k}]) +
(1-(Sum[m[[i]]*i, {i,1,k}])) *
h[(Sum[m[[i]], {i,1,k}]) / (1-(Sum[m[[i]]*i, {i,1,k}]))] +
Sum[m[[j]]*Log2[(Sum[m[[i]], {i,1,k}])/m[[j]]], {j,1,k}] +
Sum[m[[j]]*Log2[j+1], {j,1,k}];
yArr = Array[Unique[y],{Sigma}]
NMaximize[{ Re[g[yArr,Sigma]],
And@@Table[yArr[[i]]>=$MachineEpsilon, {i,Sigma} ] &&
(Sum[yArr[[i]], {i,1,Sigma}]) <
1 - (Sum[yArr[[i]] * i, {i,1,Sigma}])},
yArr, {MaxIterations->100000, Method->{"RandomSearch"}}]
```