

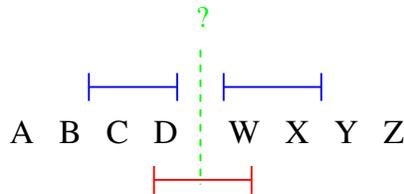
**Topics:** A mostly-unsupervised approach to the word segmentation problem, following R. K. Ando and L. Lee (2003). The question is whether simple statistics drawn from a large enough data-set can be used to accomplish a difficult language processing task.

**I. Example sequence of Japanese kanji**

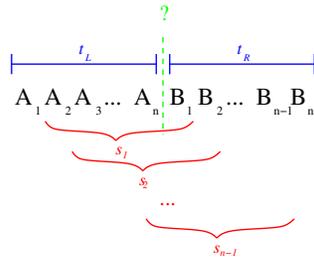
社長兼業務部長

**II. N-gram evidence**

(Character-level) bigram evidence considers the following situation:



The general  $n$ -gram situation looks like this:



for  $d := L, R$   
 for  $j := 1, 2, \dots, n-1$   
 is  $\#(t_d) > \#(s_j)$ ?

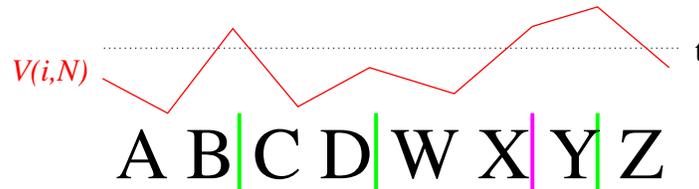
where we ask, for each choice of *tangent*  $n$ -gram  $t_L$  and  $t_R$  and for each choice of *straddling*  $n$ -gram  $s_1, s_2, \dots, s_{n-1}$ , is  $\#(t_d) > \#(s_j)$ ?

(OVER)

**III. Evidence combination** We use a “senatorial” system. Suppose we are looking at position  $i$ , and are only choosing block lengths from some fixed set  $N$ .

1. For each  $n$  in  $N$ , calculate the average number of “yes” votes among the  $2 \times (n - 1)$   $n$ -gram comparisons.
2. The final vote  $V(i, N)$  is the average of these averages.

**IV. Making segmentation decisions**



Draw a boundary if the evidence (plotted as a red line) for a location is either a *local maximum* (this induces the green boundaries) or, failing that, *above a threshold* (this induces the magenta boundary).

**V. Evaluation metrics**

- Precision: What percentage of what you thought were words were really words?
- Recall: What percentage of the real words did you mark as words?
- F: combines precision and recall:  $F = 2PR/(P+R)$

**VI. Word-level accuracy results** Training data: 37 million characters worth of unsegmented kanji sequences from 1993 NIKKEI newswire, plus about 50 segmented sequences (representing roughly eight minutes of work); the latter is used for parameter setting ( $N$  and  $t$ ).

The two algorithms on the left are two state-of-the-art (at the time) systems based on hand-crafted grammars and dictionaries containing 115,000 or 231,000 entries, respectively.

