

Dynamic Programming Approach

Given an array of words, W , initialize an array, P , that stores the minimum penalty for words $1 \dots i$. In this array, $P[i]$ stores the total minimum penalty when word $[i]$ is the last word to be displayed and, therefore, $W[i]$ is also the last word on whatever line it happens to be on. When adding another word, $W[i+1]$, we need to determine whether rearranging words $1 \dots i$ will yield a smaller penalty or not. To determine this, we can iterate through every possible line configuration of the line that ends with $W[i+1]$. If the line which ends with word $[i+1]$ begins with word $[j]$, that means that the previous line ends with $W[j-1]$. Because $P[j-1]$ stores the minimum penalty when $j-1$ is the last word on its line, we can add the value of $P[j-1]$ to the penalty of a line containing words $j \dots i+1$. Consider every value of j and find the minimum. Increment i and repeat recursively.

Finding the penalty of a line containing words $j \dots i+1$ is simple. Simply take the length allowed for each line, M , and subtract the length of words $j \dots i+1$ and spaces to find the penalty amount of empty space at the end of the line, p . As the algorithm increments j , simply add the length of word $[j-1] + 1$ to p . This calculation, throughout the entire program, is $O(n^2)$ where n is the number of words to be displayed. (Note: the requirements doc says that runtime should be $O(n \times M)$ but I could not figure out how to get that runtime. This is the closest that I could figure out.)

Recurrence Relation

Let $OPT(W_i)$ be the minimum **total cost** penalty for a layout containing $W[0] \dots W[i]$. Let M be the length allowed for each line. Let $W[i]$ be the length of the word at $W[i]$ and $W[j \dots i]$ be the cumulative length of words from $W[j]$ to $W[i]$. Given the above, we can define the following recurrence relation:

$$OPT(W_i) = \begin{cases} (M - W[i])^2 & \text{if } i \text{ is } 0 \\ \min \left\{ OPT(W_{j-1}) + (M - W[j \dots i])^2 \right\} & \text{otherwise} \end{cases}$$

where j starts from 0 and is incremented by 1 to i .

An example is in order ('cuz this is so darn confusing, pardon my language):

Consider an array Strings $W = \{\text{"ab"}, \text{"cd"}, \text{"e"}\}$; and a maximum length of $M=5$.

1. First, consider only $W[0]$. The penalty of a layout containing $W[0]$ is $(M - W[0].length)^2 = (5 - 2)^2 = 9$. So $OPT(W_0) = 9$.
2. Next, consider $W[0]$ and $W[1]$. There are two possibilities as to how the line that ends with $W[1]$ is configured. It can either start with $W[0]$, or it can start with $W[1]$. Try both possibilities:
 - A. If it starts with $W[0]$, the penalty is $(M - (W[0].length + W[1].length + 1))^2 = 0$.
 - B. If it starts with $W[1]$, the total penalty is the penalty of the entire layout with the last line ending with $W[0]$ + the penalty of the line ending with $W[1]$. We already have tabulated the total penalty of the layout where the last line ends with $W[0]$ in step 1: $OPT(W_0) = 9$. The penalty of the line starting and ending with $W[1] = (M - W[1].length)^2 = 9$. Add $OPT(W_0) = 9$ and the penalty of the line ending with $W[1]$ to get the total penalty of this layout configuration: 18.
 - C. $0 < 18$. Therefore, $OPT(W_1) = 0$.
3. Next, consider $W[0]$, $W[1]$, and $W[2]$. There are three possibilities as to how the line that ends with $W[2]$ is configured. It can either start with $W[0]$, $W[1]$, or $W[2]$.

- A. If it starts with $W[0]$, note that $M - (W[0].length + W[1].length + W[2].length + 2) = -2$. These three words cannot fit on a single line.
- B. If it starts with $W[1]$, the total penalty is the penalty of the entire layout with the last line ending with $W[0]$ + the penalty of the line ending with $W[2]$. We already have tabulated the penalty of the line ending with $W[0]$ in step 1: $OPT(W_0) = 9$. The penalty of the line starting with $W[i]$ and ending with $W[2] = (M - (W[1].length + M[2].length + 1))^2 = 1$. Add $OPT(W_0)$ and the penalty of the line ending with $W[2]$ to get 10.
- C. If it starts with $W[2]$, the total penalty is the penalty of the entire layout with the last line ending with $W[1]$ + the penalty of the line ending with $W[2]$. We already have tabulated the total penalty of the layout in the case that the last line ends with $W[1]$ in step 2: $OPT(W_1) = 0$. The penalty of the line starting and ending with $W[2] = (M - W[2].length)^2 = 16$. Add $OPT(W_1) = 0$ and the penalty of the line ending with $W[1]$ to get the total penalty of this layout configuration: 16.
- D. $10 < 16$. Therefore, $OPT(W_1) = 10$.

Optimal Layout Construction

When $OPT(W_i)$ is determined, the value of j that yielded that optimal penalty is recorded in a layout array L at index i . Note that j represents the first word on the line in which $W[i]$ is the last word. Therefore, the line which ends with $W[i]$ starts from $W[L[i]]$ (because, once again, $L[i] = j$) and ends with $W[i]$. Once we have determined that the line that ends with $W[i]$ starts with $W[L[i]]$, we know that the preceding line ends with $W[L[i] - 1]$ (because, $L[i] - 1 = j - 1$). Therefore, we move to index $L[i] - 1$ in L to determine the first word on this line. Repeat until all lines have been constructed.

Big-O and Space Requirements

My algorithm is $O(n^2)$ where n is the number of words to be displayed. M , the maximum length of a line, does not factor into the runtime at all. It is simply used as a method of determining the penalty of a particular line (penalty of a line = $(M - W[i])^2$). The algorithm is $O(n^2)$ because for each additional word i considered, we must consider all of the possibilities of how the line that ends with i is constructed. It can start with word 0, or word 1... word i . So, for every individual value of i , finding the optimal penalty is $O(i)$, which is essentially $O(n)$. Because the above calculation must be done for every single word, the runtime of the entire algorithm is $O(n^2)$. The algorithm uses two arrays whose length is equal to the number of words. Therefore, the space cost is $O(n)$.