

Pairwise Alignment

- Given two strings S and T over some alphabet.

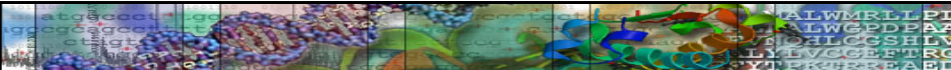
Length of S is $|S|$ and that of T is $|T|$.

Define $a(i, j)$ to be the value of an **optimal alignment** of strings:

$S[1], S[2], \dots, S[i]$ and
 $T[1], T[2], \dots, T[j]$

$a(|S|, |T|)$ is the value of an **optimal alignment** of S and T .


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Filling in the DP Table

- DP uses a table of size $(|S|+1) \times (|T|+1)$.
- $a(i, j)$ corresponds to the optimal alignment of the i^{th} prefix of S with the j^{th} prefix of T .
- The dynamic programming algorithm fills in the entries of the table (matrix) by computing the values of $a(i, j)$ from top to bottom, left to right.
- The value of the optimal alignment is given by $a(|S|, |T|)$.

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Filling Entry $a(i,j)$ in the Table


$a(i-1, j-1) + p(S[i], T[j])$	$a(i-1, j) + g$
$a(i, j-1) + g$	$a(i, j)$

align $S[i]$
with “-”

align $T[j]$ with “-”

g specifies the gap penalty
 $p(S[i], T[j]) = 1$ if $S[i] = T[j]$
 $p(S[i], T[j]) = 0$ otherwise


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DP: Bookkeeping and Retracing

- Draw lines crossing the entries in the matrix to show from which entry in the matrix we derived the maximum score for each entry $a(i, j)$.
- To determine the solution of the optimal alignment, simply retrace the steps from entry $a(|S|, |T|)$ to entry $a(0, 0)$.

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DP for Pairwise Alignment

Algorithm Similarity


input: sequences s and t
output: similarity between s and t

```

m ← |s|
n ← |t|
for i ← 0 to m do
    a[i, 0] ← i × g
for j ← 0 to n do
    a[0, j] ← j × g
for i ← 1 to m do
    for j ← 1 to n do
        a[i, j] ← max(a[i - 1, j] + g,
                      a[i - 1, j - 1] + p(i, j),
                      a[i, j - 1] + g)
return a[m, n]
```

Algorithm for filling in the DP table row by row, from top to bottom, left to right. g specifies the gap penalty.

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Pairwise Alignment: Traceback

Algorithm Align

input: indices i, j , array a given by algorithm *Similarity*
output: alignment in $align-s$, $align-t$, and length in len

```

if i = 0 and j = 0 then
    len ← 0
else if i > 0 and a[i, j] = a[i - 1, j] + g then
    Align(i - 1, j, len)
    len ← len + 1
    align-s[len] ← s[i]
    align-t[len] ← -
else if i > 0 and j > 0 and a[i, j] = a[i - 1, j - 1] + p(i, j) then
    Align(i - 1, j - 1, len)
    len ← len + 1
    align-s[len] ← s[i]
    align-t[len] ← t[j]
else // has to be j > 0 and a[i, j] = a[i, j - 1] + g
    Align(i, j - 1, len)
    len ← len + 1
    align-s[len] ← -
    align-t[len] ← t[j]
```

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