## Genome 540 Discussion

February 13th, 2024
Clifford Rostomily

## Assignment 5 Questions?

- Part 1
- Build a weighted edit graph for 3 amino acid sequences of the insulin protein (human, frog, water buffalo) using the BLOSUM62 scoring matrix and save it as a text file
- Part 2:
- Use your program from HW4 to find the max weight path through the edit graph

Assignment 6

## Overview

- Write a program to identify regions of elevated copy-number using the D-segment algorithm
- Run the program on chromosome 16 from individual CHM13


## D-segment motivation

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Whole region has a score of 105 .

## D-segment motivation

However, these two sub-segments may represent biologically distinct events...

## D-segment algorithm



What values of S and D would separate these segments?

## D-segment algorithm



What values of $S$ and $D$ would separate these segments?
$S<=50$ and $D>=-45$
*** D would probably have to be less than -10 as well

## Copy Number Variation



NGS read coverage will be higher for that gene when mapped to reference


Same as ref.


Duplication

## Data - Read Start Counts



Position
(chr16)

## Convert Counts to Scores

- Background:
- m = mean(counts starts)
- count = counts at a position
- B ~ Poisson(m)
- $\mathrm{L}(\mathrm{B} \mid$ count $)=\mathrm{P}($ count $\mid \mathrm{B})$
- Heterozygous duplication:
- D ~Poisson(1.5*m)
- L(D|count) $=P($ count $\mid D)$
- Score
- Score $=\log 2(\mathrm{LR}(\mathrm{L}(\mathrm{D} \mid$ count $) / \mathrm{L}(\mathrm{B} \mid c o u n t)))$


## Pseudocode

## $O(N)$ algorithm to find all maximal D-segs:

```
cumul = max = 0; start = 1;
for (i=1;i\leqN; i++) {
    cumul += s[i];
    if (cumul \geq max)
        {max = cumul; end = i;}
    if (cumul \leq 0 or cumul \leqmax + D or i== N) {
            if (max \geqS)
                {print start, end, max; }
            max = cumul = 0; start = end = i + 1;/* NO BACKTRACKING
                    NEEDED! */
    }
}
```


## Example

| Position | 1 | 2 | 3 | 4 | 5 | 6 | 7 | 8 |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| Read Start Counts | 0 | 0 | 1 | 2 | 0 | 2 | 0 | 0 |
| Score | -0.5 | -0.5 | 0.52 | 1.1 | -0.5 | 1.1 | -0.5 | -0.5 |

$O(N)$ algorithm to find all maximal D-segs:

```
cumul = max = 0; start = 1;
for (i=1; i\leqN; i++) {
    cumul += s[i];
    if (cumul \geq max)
        {max = cumul; end = i;}
    if (cumul }\leq0\mathrm{ or cumul }\leq\operatorname{max}+\textrm{D}\mathrm{ or i== N) {
        if (max \geqS)
            {print start, end, max; }
        max = cumul = 0; start = end = i + 1;/* NO BACKTRACKING
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    }
}
```


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| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| Read Start Counts | 0 | 1 | 2 | 2 | 0 | 2 | 0 | 0 |
| Score | -0.5 | 0.52 | 1.1 | 1.1 | -0.5 | 1.1 | -0.5 | -0.5 |

$D=-3$
$S=3$
$\max =0$
start $=1$
end $=1$
cumul $=0$
$O(N)$ algorithm to find all maximal D-segs:

```
\[
\text { cumul }=\max =0 ; \text { start }=1 ;
\]
\[
\text { for }(i=1 ; i \leq N ; i++)\{
\]
cumul += s[i];
\[
\text { if (cumul } \geq \max )
\]
\[
\{\max =\text { cumul; } \text { end }=\mathrm{i} ;\}
\]
\[
\text { if (cumul } \leq 0 \text { or cumul } \leq \max +\text { D or } \mathrm{i}=\mathrm{N} \text { ) }\{
\]
\[
\text { if }(\max \geq \mathrm{S})
\]
\[
\{\text { print start, end, max; \} }
\]
\[
\max =\text { cumul }=0 ; \text { start }=\text { end }=\mathrm{i}+1 ; / * \text { NO BACKTRACKING }
\]
NEEDED! */

\section*{Example}
\begin{tabular}{|c|c|c|c|c|c|c|c|c|}
\hline Position & 1 & 2 & 3 & 4 & 5 & 6 & 7 & 8 \\
\hline Read Start Counts & 0 & 1 & 2 & 2 & 0 & 2 & 0 & 0 \\
\hline Score & -0.5 & 0.52 & 1.1 & 1.1 & -0.5 & 1.1 & -0.5 & -0.5 \\
\hline
\end{tabular}
\(D=-3\)
\(S=3\)
\(\max =0.52\)
start \(=2\)
end \(=2\)
cumul \(=0.52\)
\(O(N)\) algorithm to find all maximal D-segs:
```

cumul = max = 0; start = 1;
for (i=1;i\leqN; i++) {
cumul += s[i];
if (cumul \geq max)
{max = cumul; end = i;}
if (cumul }\leq0\mathrm{ or cumul }\leq\operatorname{max}+\textrm{D}\mathrm{ or i== N) {
if (max \geqS)
{print start, end, max; }
max = cumul = 0; start = end = i + 1;/* NO BACKTRACKING
NEEDED! */
}
}

```

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\begin{tabular}{|c|c|c|c|c|c|c|c|c|}
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\hline Read Start Counts & 0 & 1 & 2 & 2 & 0 & 2 & 0 & 0 \\
\hline Score & -0.5 & 0.52 & 1.1 & 1.1 & -0.5 & 1.1 & -0.5 & -0.5 \\
\hline
\end{tabular}
\(D=-3\)
\(S=3\)
\(\max =1.62\)
start \(=2\)
end \(=3\)
cumul \(=1.62\)
\(O(N)\) algorithm to find all maximal D-segs:
```

$$
\text { cumul }=\max =0 ; \text { start }=1 ;
$$

$$
\text { for }(i=1 ; i \leq N ; i++)\{
$$

cumul += s[i];
if (cumul $\geq$ max ) \{max = cumul; end $=\mathrm{i}$;\}
if (cumul $\leq 0$ or cumul $\leq \max +$ D or $\mathrm{i}=\mathrm{N}$ ) $\{$ if ( $\max \geq \mathrm{S}$ )
\{print start, end, max; \}
$\max =$ cumul $=0 ;$ start $=$ end $=\mathrm{i}+1 ; / *$ NO BACKTRACKING NEEDED! */

## Example

| Position | 1 | 2 | 3 | 4 | 5 | 6 | 7 | 8 |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| Read Start Counts | 0 | 1 | 2 | 2 | 0 | 2 | 0 | 0 |
| Score | -0.5 | 0.52 | 1.1 | 1.1 | -0.5 | 1.1 | -0.5 | -0.5 |

$D=-3$
$S=3$
$\max =2.72$
start $=2$
end $=4$
cumul $=2.72$
$O(N)$ algorithm to find all maximal D-segs:

```
\[
\text { cumul }=\max =0 ; \text { start }=1 ;
\]
\[
\text { for }(i=1 ; i \leq N ; i++)\{
\]
\[
\text { cumul }+=\mathrm{s}[\mathrm{i}] ;
\]
\[
\text { if (cumul } \geq \max )
\]
\[
\{\max =\text { cumul; end }=\mathrm{i} ;\}
\]
\[
\text { if (cumul } \leq 0 \text { or cumul } \leq \max +\text { D or } \mathrm{i}=\mathrm{N})\{
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\text { if }(\max \geq \mathrm{S})
\]
\[
\{\text { print start, end, max; \}}
\]
\[
\max =\operatorname{cumul}=0 ; \text { start }=\text { end }=\mathrm{i}+1 ; / * \text { NO BACKTRACKING }
\]
NEEDED! */

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\begin{tabular}{|c|c|c|c|c|c|c|c|c|}
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\hline Read Start Counts & 0 & 1 & 2 & 2 & 0 & 2 & 0 & 0 \\
\hline Score & -0.5 & 0.52 & 1.1 & 1.1 & -0.5 & 1.1 & -0.5 & -0.5 \\
\hline
\end{tabular}
\(D=-3\)
\(S=3\)
\(\max =2.22\)
start \(=2\)
end \(=4\)
cumul \(=2.22\)
\(O(N)\) algorithm to find all maximal D-segs:
```

cumul = max = 0; start = 1;
for (i=1; i < N; i++) {
cumul += s[i];
if (cumul \geq max)
{max = cumul; end = i;}
if (cumul }\leq0\mathrm{ or cumul <max + D or i== N) {
if (max \geqS)
{print start, end, max; }
max = cumul = 0; start = end = i + 1;/* NO BACKTRACKING
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```

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\begin{tabular}{|c|c|c|c|c|c|c|c|c|}
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\hline
\end{tabular}
\(D=-3\)
\(S=3\)
\(\max =3.32\)
start \(=2\)
end \(=6\)
cumul \(=3.32\)
\(O(N)\) algorithm to find all maximal D-segs:
```

cumul = max = 0; start = 1;
for (i=1; i < N; i++) {
cumul += s[i];
if (cumul \geq max)
{max = cumul; end = i;}
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\hline
\end{tabular}
\(D=-3\)
\(S=3\)
\(\max =3.32\)
start \(=1\)
end \(=1\)
cumul \(=2.82\)
\(O(N)\) algorithm to find all maximal D-segs:
```

$$
\text { cumul }=\max =0 ; \text { start }=1 ;
$$

$$
\text { for }(i=1 ; i \leq N ; i++)\{
$$

cumul += s[i];

$$
\text { if (cumul } \geq \max )
$$

$$
\{\max =\text { cumul; } \text { end }=\mathrm{i} ;\}
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            {print start, end, max; }
        max = cumul = 0; start = end = i + 1;/* NO BACKTRACKING
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    }
}
```


## Reminders

- HW6 due this Sunday, 11:59pm
- Please have your name in the filename of your homework assignment and match the template

