## Recombination, Phylogenies and Parsimony

Overview:
The History of a set of Sequences
The Ancestral Recombination Graph (ARG) \& the minimal ARG
Dynamical programming algorithm for finding the minimal ARG
Branch and Bound algorithm for minimal ARGs

Domain of Application:

Sequence Variation
Fine scale mapping of disease genes
Pathogen Evolution

## Mutations, Duplications/Coalescents \& Recombinations

Mutation Duplication/ Coalescent Recombination

|  | $\nabla$ |
| :---: | :---: |

"The minimal number of recombinations for a set of sequences"


## Recombination-Coalescence Illustration copied from Husoon 199 <br> Intensities

## Coales. Recomb.



## The 1983 Kreitman Data \& the infinite site assumption

(M. Kreitman 1983 Nature from Hartl \& Clark 1999)


Infinite Site Assumption (Otha \& Kimura, 1971)
Each position is at most hit by one mutation

## Recoded Kreitman data

i. $(0,1)$ ancestor state known.
ii. Multiple copies represented by 1 sequences
iii. Non-informative sites could be removed


## Compatibility

|  | 1 | 2 | 3 | 4 | 5 | 6 | 7 |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| 1 | A | T | G | T | G | T | C |
| 2 | A | T | G | T | G | A | T |
| 3 | C | T | T | C | G | A | C |
| 4 | A | T | T | C | G | T | A |
|  |  |  | i | i |  | i |  |


i. $3 \& 4$ can be placed on same tree without extra cost.
ii. $3 \& 6$ cannot.

Definition: Two columns are incompatible, if they are more expensive jointly, than separately on the cheapest tree.

Compatibility can be determined without reference to a specific tree!!

## Hudson \& Kaplan's $\mathbf{R}_{\underline{M}}$

(k positions can have at most ( $k+1$ ) types without recombination) ex. Data set:

A underestimate for the number of recombination events:


If you equate $R_{M}$ with expected number of recombinations, this could be used as an estimator. Unfortunately, $R_{M}$ is a gross underestimate of the real number of recombinations.


## Myers-Griffiths' $\mathbf{R}_{M}$ <br> (2002)

Basic Idea: 1

Minimize $\sum_{l=1}^{S-1} r_{l}$ so $\sum_{l=i}^{j-1} r_{l} \geq B_{i, j}$ for all $B_{i, j}$ 's and $r_{l}$ 's positive

Define $\mathrm{R}: \mathrm{R}_{\mathrm{j}, \mathrm{k}}$ is optimal solution to restricted interval., then: $R_{j, k}=\max \left\{R_{j, i}+B_{i, k}: i=j, j+1, . . k-1\right\}$


- 11 sequences of alcohol dehydrogenase gene in Drosophila melanogaster. Can be reduced to 9 sequences ( 3 of 11 are identical).
- 3200 bp long, 43 segregating sites.

| Methods | \# of rec events <br> obtained |
| :--- | :---: |
| Hudson \& Kaplan (1985) | 5 |
| Myers \& Griffiths (2002) | 6 |
| Song \& Hein (2002). Set theory based approach. | 7 |
| Song \& Hein (2003). Current program using rooted trees. | 7 |

We have checked that it is possible to construct an ancestral recombination graph using only 7 recombination events.

## Recombination Parsimony

Hein, 1990,93 \& Song \& Hein, 2002+




## Metrics on Trees based on subtree transfers.

Trees including branch lengths


Unrooted tree topologies


Rooned treetoplogies 2 event
Rooted tree topologies


Coalescent toplogies 3 event
Tree topologies with age ordered internal nodes


Pretending the easy problem (unrooted) is the real problem (age ordered), causes violation of the triangle inequality:


## Tree Combinatorics and Neighborhoods

Observe that the size of the unit-neighbourhood of a tree does not grow nearly as fast as the number of trees $\delta(T):=$ number of trees one SPR operation away from a given tree $T$.

$$
\begin{aligned}
& (2 n-3)!!=\frac{(2 n-2)!}{2^{n-1}(n-1)!} \begin{array}{c}
3 n^{2}-13 n+14 \\
2(n-3)(2 n-7)
\end{array} \\
& 4(n-2)^{2}-2 \sum_{m=1}^{n-2}\left\lfloor\log _{2}(m+1)\right\rfloor
\end{aligned}
$$

$$
\frac{n!(n-1)!}{2^{n-1}}<\frac{1}{3}\left(2 n^{3}-3 n^{2}-20 n+39\right)
$$

$$
\frac{1}{6}\left\{4 n^{3}-9 n^{2}-13 n+42-3(2 n+3)\left\lfloor\frac{n-1}{2}\right\rfloor+9\left(\left\lfloor\frac{n-1}{2}\right\rfloor\right)^{2}\right\}
$$

Allen \& Steel (2001)


- indicates an incompatible pair ( $0, \infty$ )



## The Good News: Quality of the estimated local tree



$$
\begin{aligned}
& n=7 \\
& \rho=10 \\
& \Theta=75
\end{aligned}
$$



The Bad News: Actual, potentially detectable and detected recombinations


| Leaves | Root | Edge-Length | Topo-Diff | Tree-Diff |
| :--- | :--- | :--- | :--- | :---: |
| 2 | 1.0 | 2.0 | 0.0 | .666 |
| 3 | 1.33 | 3.0 | 0.0 | .694 |
| 4 | 1.50 | 3.66 | 0.073 | .714 |
| 5 | 1.60 | 4.16 | 0.134 | .728 |
| 6 | 1.66 | 4.57 | 0.183 | .740 |
| 10 | 1.80 | 5.66 | 0.300 | .769 |
| 15 | 1.87 | 6.50 | 0.374 | .790 |
|  |  |  |  |  |

## Minimal ARG

True ARG


## Branch and Bound Algorithm



1. The number of ancestral sequences in the ACs.
2. Number of ancestral sequences in the ACs for neighbor pairs

3. AC compatible with the minimal ARG.
4. AC compatible with close-to-minimal ARG.

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## References

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