

## **4. Molecular population genetics**

Polymorphisms on the amino acid and nucleotide level

- 4.1 theories of molecular evolution
- 4.2 sequence divergence rates
- 4.3 rates corrected for multiple hits
- 4.4 molecular clocks
- 4.5 gene genealogy and coalescent
- 4.6 within species mol. polymorphism
- 4.7 synonymous and non-synonymous rates
- 4.8 two tests of neutrality
- 4.9 recombination and polymorphism

### **4.1 Theories of molecular evolution**

most mutations are deleterious and quickly removed

Classical theory

natural selection is the major evolutionary force  
predicts little genetic variation  
because positive mutations are quickly fixed

Balance theory

most polymorphisms due to balanced selection  
fails to explain protein electrophoresis results  
15-50% of enzyme coding genes are polymorphic  
with two or more widespread alleles

Neutral theory

most polymorphisms are nearly selectively neutral  
RGD is a major evolutionary force

### **Ex 1: heterozygosity and population size**

neutral theory prediction for IAM:  $\hat{H} = \frac{\theta}{1+\theta}$ ,  $\theta = 4N_e\mu$

$\mu$  = mutation rate per nucleotide site per generation

Fig 8.2, p. 319: 77 species data do not fit the prediction  
variation in  $H$  is lower than expected under neutrality  
given the huge variation in EPS

Possible explanations

several evolutionary forces involved  
different species - different magnitudes of the forces  
incorrectly estimated  $N_e$

## **4.2 Sequence divergence rates**

Two homologous sequences

sequence length:  $L$  amino acids,  $l = 3L$  nucleotide sites

$d$  = observed nucleotide differences per site,  $0 \leq d \leq 1$

$D$  = observed amino acid diff. per site,  $0 \leq D \leq 1$

$t$  = divergence time between the homologous sequences

Parameter estimation problem: using  $d$ ,  $D$  estimate

nucleotide substitution rate  $\lambda = \frac{k}{2t}$

amino acid replacement rate  $\Lambda = \frac{K}{2t}$

$k$ ,  $K$  = actual numbers of differences per site

Multiple hits examples

- 1) observed A → C, full history A → T → G → C
- 2) observed A → A, full history A → T → A

## Ex 2: bacterial gene

Coding region of *trpA* in two related bacterial strains

K12 (*E.coli*) and LT2 (*Salmonella typhimurium*)

diverged  $t = 80$  MY ago (mammalian radiation)

0*04	004*	004*	002	002	002	002	004	004	002
GTC	GCA	CCT	ATC	TTC	ATC	TGC	CCG	CCA	AAT
Val	Ala	Pro	Ile	Phe	Ile	Cys	Pro	Pro	Asn
ATC	GCG	CCG	ATC	TTC	ATC	TGC	CCG	CCA	AAT
Ile	Ala	Pro	Ile	Phe	Ile	Cys	Pro	Pro	Asn
N	S	S							
004*	002	002	002*	204*	204	004	002	0*02*	004*
GCC	GAT	GAC	GAC	CTG	CTG	CGC	CAG	ATA	GCC
Ala	Asp	Asp	Asp	Leu	Leu	Arg	Gln	Ile	Ala
GCG	GAT	GAC	GAT	CTT	CTG	CGC	CAG	GTC	GCA
Ala	Asp	Asp	Asp	Leu	Leu	Arg	Gln	Val	Ala
S			S	S				N S	S

Observed differences: 9 nucleotide, 2 amino acid

$$l = 60, d = 9/60 = 0.15, L = 20, D = 2/20 = 0.10$$

Uncorrected estimates of the rates  $\lambda$  and  $\Lambda$ :

$$\tilde{\lambda} = \frac{d}{2t} = 0.94 \cdot 10^{-9} \text{ substitutions per site per year}$$

$$\tilde{\Lambda} = \frac{D}{2t} = 0.63 \cdot 10^{-9} \text{ replacements per site per year}$$

## Substitution and mutation rates

Diffusion approximation prediction of  $\lambda$

$$\begin{aligned}\lambda &= \#(\text{mutations per gener}) \times (\text{fixation probability}) \\ &= 2N\mu \times u\left(\frac{1}{2N}\right) \approx \frac{4N_e s \mu}{1 - e^{-4N_e s}} \quad (\text{additive selection})\end{aligned}$$

If most substitutions are

deleterious:  $\lambda$  decreases with  $N_e$

advantageous:  $\lambda$  increases with  $N_e$

Neutral substitutions:  $\lambda = \mu$  is independent of  $N_e$

### Ex 3: diffusion simulations

Fig 8.1, p. 317: neutral substitutions for different  $\mu$

average fixation time =  $4N_e$

average time between substitutions  $\frac{1}{\mu}$

## 4.3 Rates corrected for multiple hits

### Corrected replacement rate

Poisson process model for one amino acid site

replacement number  $X \in \text{Pois}(\Lambda u)$  during time  $u$

no reverse mutations for amino acids (20 letters)

Proportion of differences per site

$$\begin{aligned}D &= \frac{1}{L}(1_{\{X_1 > 0\}} + \dots + 1_{\{X_L > 0\}}) \\ E(D) &= 1 - e^{-2t\Lambda}, \quad \text{Var}(D) = \frac{1}{L}(1 - e^{-2t\Lambda})e^{-2t\Lambda}\end{aligned}$$

Method of moments estimate:  $D = 1 - e^{-2t\hat{\Lambda}}$  implies

Corrected replacement rate  $\hat{\Lambda} = -\frac{\ln(1-D)}{2t}$

Estimated  $K$ :  $\hat{K} = -\ln(1 - D)$ ,  $s_{\hat{K}} = \sqrt{\frac{D}{L(1-D)}}$

saturated  $D = 1$  gives  $\hat{K} = \infty$

**Ex 2: bacterial gene**

$$\hat{K} = 0.1053, s_{\hat{K}} = 0.0745, \hat{\Lambda} = 0.66 \cdot 10^{-9}$$

**Markov Chain models**

MC is a stochastic model assuming that

given the current state future is independent of past

Transition rates

	To A	To C	To G	To T
From A	—	$r_{AC}$	$r_{AG}$	$r_{AT}$
From C	$r_{CA}$	—	$r_{CG}$	$r_{CT}$
From G	$r_{GA}$	$r_{GC}$	—	$r_{GT}$
From T	$r_{TA}$	$r_{TC}$	$r_{TG}$	—

Equilibrium base composition

$$F = (\pi_A, \pi_C, \pi_G, \pi_T) \text{ with } \pi_A + \pi_C + \pi_G + \pi_T = 1$$

Substitution rate

$$\lambda = \pi_A(r_{AC} + r_{AG} + r_{AT}) + \pi_C(r_{CA} + r_{CG} + r_{CT}) + \pi_G(r_{GA} + r_{GC} + r_{GT}) + \pi_T(r_{TA} + r_{TC} + r_{TG})$$

**Jukes-Cantor model**

JC	A	T	C	G	
A	—	$\alpha$	$\alpha$	$\alpha$	$F = (0.25, 0.25, 0.25, 0.25)$ $\lambda = 3\alpha$
T	$\alpha$	—	$\alpha$	$\alpha$	
C	$\alpha$	$\alpha$	—	$\alpha$	
G	$\alpha$	$\alpha$	$\alpha$	—	

JC genetic distance corrected for multiple changes

$$\hat{k} = \frac{3}{4} \ln\left(\frac{3}{3-4d}\right), s_{\hat{k}} = \frac{\sqrt{d(1-d)}}{(1-\frac{4}{3}d)\sqrt{t}}$$

$\hat{k} \approx d$  if  $d$  is small

Corrected substitution rate $\hat{\lambda} = \frac{\hat{k}}{2t}$
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Saturated  $d = \frac{3}{4}$  when  $\frac{1}{4}$  of sites match by chance  
gives  $\hat{k} = \infty$

### Ex 2: bacterial gene

$$\hat{k} = 0.1674, s_{\hat{k}} = 0.0576, \hat{\lambda} = 1.05 \cdot 10^{-9}$$

### Kimura two-parameter model

Transitions are more usual than transversions

transversions: purines  $\{A, G\} \longleftrightarrow$  pyrimidines  $\{T, C\}$

transitions:  $A \longleftrightarrow G$  and  $T \longleftrightarrow C$

K2P	A	C	G	T	
A	—	$\beta$	$\alpha$	$\beta$	$F = (0.25, 0.25, 0.25, 0.25)$
C	$\beta$	—	$\beta$	$\alpha$	$\lambda = \alpha + 2\beta$
G	$\alpha$	$\beta$	—	$\beta$	
T	$\beta$	$\alpha$	$\beta$	—	

K2P genetic distance

$$\hat{k} = -\frac{1}{2} \ln(1 - 2P - Q) - \frac{1}{4} \ln(1 - 2Q)$$

$P$  = differences per site due to transitions

$Q = p - P$  = differences per site due to transversions

**Ex 2: bacterial gene**

4 transitions,  $P = \frac{4}{60} = 0.0667$

5 transversions,  $Q = \frac{5}{60} = 0.0833$

$\hat{k} = 0.1221 + 0.0456 = 0.1677$ ,  $\hat{\lambda} = 1.05 \cdot 10^{-9}$

**Ex 4: transition-transversion ratio**

$\alpha/\beta$  ratio for different sequences:

12S rRNA = 1.75, alpha- and beta-globins = 0.66

pseudo eta-globins = 2.7, mtDNA = 9.0

**4.4 Molecular clocks**

Molecular clock hypothesis: average rates of

molecular evolution  $\lambda$ ,  $\Lambda$  are nearly constant over time

**Ex 5: alpha-globin data**

Table 8.1, p. 330: differences between alpha-globins

$D$  above the diagonal,  $\hat{K}$  below the diagonal

Divergence times: Fig 8.6, p. 329

phylogentic tree based on paleontological data

Molecular clock: data fit a straight line, Fig 8.7, p. 330

regression line slope =  $2\hat{\Lambda}$ ,  $\hat{\Lambda} = 0.9 \cdot 10^{-9}$

## Ex 6: beta-globin data

Primates,  $L = 146$ , fossil evidence for 6 paires of species

$t$ MY ( $x_i$ )	85	60	42	40	30	15
# differences	25.5	24.0	6.25	6.0	2.5	1.0
$D$	0.175	0.164	0.043	0.041	0.017	0.007
$\hat{K}$ ( $y_i$ )	0.192	0.180	0.044	0.042	0.018	0.007

Least squares estimate of the slope  $b = 0.00315$

$$\hat{\Lambda} = \frac{b}{2} = 1.58 \cdot 10^{-9} \text{ replacements per site per year}$$

Coefficient of determination

$$r^2 = 86\% \text{ of variation in } Y \text{ is explained by } X$$

## Variation in clock rates

Different substitution rates

for different genes and different taxonomic groups

Episodic clock: substitution is a Poisson process with

randomly changing rate (variance larger than mean)

## Ex 7: viral clocks

Fig 8.9, p.334:  $NS$  gene of influenza virus

$$l = 890, \lambda = 1.9 \cdot 10^{-3} \text{ subst. per site per year}$$

$pol$  gene of HIV:  $\lambda = 0.5 \cdot 10^{-3}$  per site per year

divergence time between HIV1 and HIV2 is 200 years



### **Ex 8: clock retardation**

Fig 8.10, p. 335: *Adh* gene of *Drosophila*

slow-down of substitutions in *D. pseudoobscura* clade

### **Generation-time effect**

Neutral evolution theory prediction:

species with shorter generation times evolve faster

strong effect observed for syn. subst. in mammals

Fig 8.8, p. 332: weak effect for amino-acid replacements

evolutionary rate for proteins is nearly constant across

species if time is measured in years, not generations

Explanation by negative selection:  $\Lambda$  decreases with  $N$

$N$  is inversely proportional to generation time

## **4.5 Gene genealogy and coalescent**

Gene genealogy =

tree formed by sequences of alleles from a single species

### **Ex 9: *Adh* gene in *D.melanogaster***

Fig 8.15, p. 346: parsimony tree

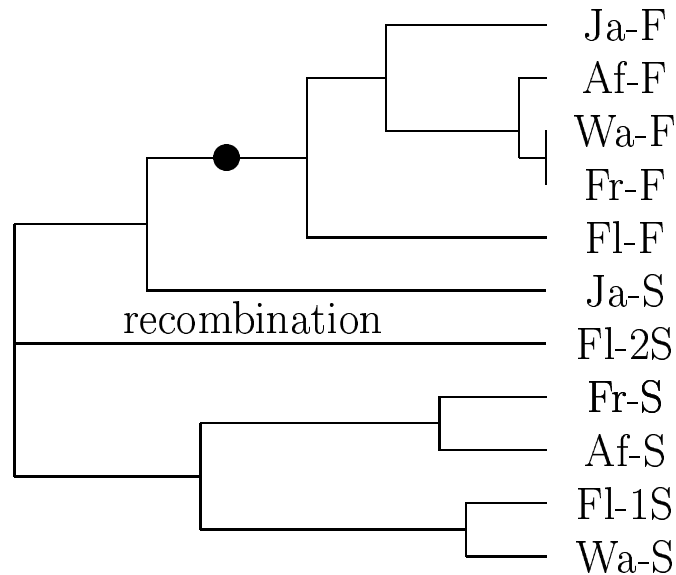
for eleven *Adh* alleles in *D.melanogaster*

sampled from different geographical regions

two allozymes Fast and Slow

Branch lengths are proportional to nucleotide

differences estimated by parsimony algorithm



## Coalescent

a simple stochastic model of a gene genealogy  
 for  $n$  chromosomes sampled from a large population  
 Coalescent models evolution backward in time  
 diffusion approximation: evolution forward in time  
 backward simulations more effective in view of RGD  
 Coalescent is based on WFM with neutral mutations  
 reproduction and mutation processes are independent

A unit of coalescent time =  $2N$  generations in WFM

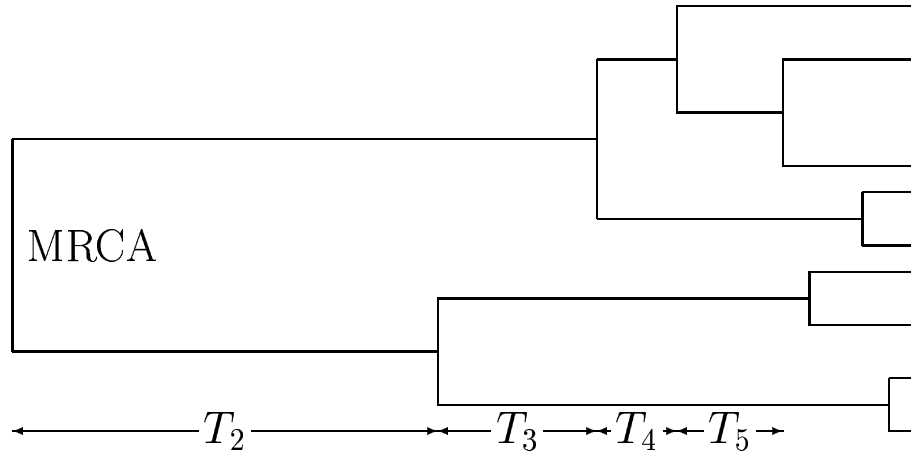
Topology of the coalescent tree

any out of  $\binom{n}{2}$  pairs of ancestral lines join first

Coalescent branch lengths:  $T_2 \in \text{Exp}(1)$ ,  $T_n \in \text{Exp}(\binom{n}{2})$

$E(T_n) = \frac{2}{n(n-1)}$  more branches - sooner the next merger

$\sigma(T_n) = \frac{2}{n(n-1)}$  huge uncertainty in the tree evolution



Scaled time to the most recent common ancestor

$$T_{\text{MRCA}} = T_2 + T_3 + \dots + T_n \text{ sum of independent r.v.}$$

$$E(T_{\text{MRCA}}) = 2\left(1 - \frac{1}{n}\right)$$

If  $n = 2$ , then  $T_{\text{MRCA}} = T_2$ ,  $E(T_2) = 1$ ,  $\text{Var}(T_2) = 1$

If  $n$  is large, then  $E(T_{\text{MRCA}}) \approx 2$ ,  $\text{Var}(T_{\text{MRCA}}) \approx 1.16$

Fixation time of a new neutral mutation

is approximately  $T_{\text{MRCA}} \times 2N$  with  $n = 2N$

the average fixation time  $\approx 4N$

Total branch length in the gene tree

$$J_n = 2T_2 + 3T_3 + \dots + nT_n \text{ sum of independent r.v.}$$

$$\begin{aligned} E(J_n) &= 2a_1 & a_1 &= 1 + \frac{1}{2} + \dots + \frac{1}{n-1} \\ \text{Var}(J_n) &= 4a_2 & a_2 &= 1 + \frac{1}{4} + \dots + \left(\frac{1}{n-1}\right)^2 \end{aligned}$$

Total length  $L_n$  of the external branches

$$E(L_n) = 2 \text{ is independent of } n$$

## Hypothesis testing using trees

Tree shapes explained by the coalescent theory

a) Theoretical coalescent tree:

constant population size

neutral mutations (no selection), no recombination

b) Star-like tree

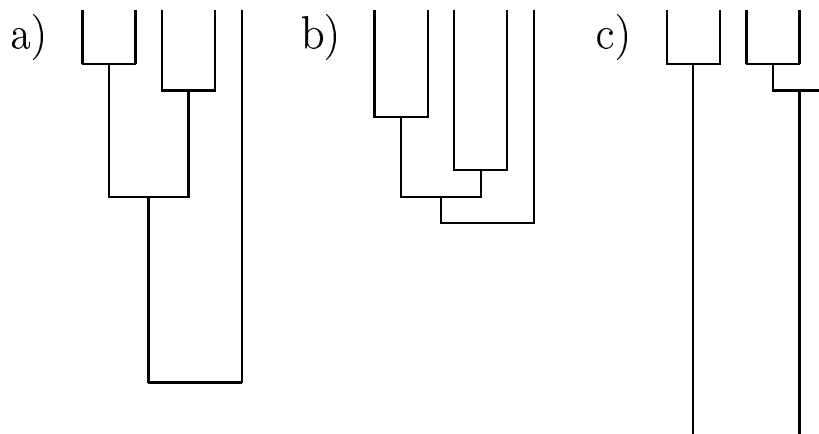
growing population size, bottleneck (all loci) or

positive selection, recent fixation (single locus)

c) Longer branches near the root:

population subdivision (all loci) or

balancing selection (single locus)



## 4.6 Within species molecular polymorphism

Two measures of molecular polymorphism

nucleotide polymorphism  $S = \frac{\#(ss)}{l}$ , segregating sites

nucleotide diversity  $\pi = \frac{\#(pmm)}{\binom{n}{2} \cdot l}$ , pairwise mismatches

Alternative way of computing  $\pi$ :  $\pi = \frac{n}{n-1} \bar{h}$   
 average heterozygosity  $\bar{h} = \frac{h_1 + \dots + h_l}{l}$   
 one site heterozygosity  $h_i = 1 - \hat{p}_{iA}^2 - \hat{p}_{iC}^2 - \hat{p}_{iG}^2 - \hat{p}_{iT}^2$

**Ex 10: Rh3 gene of D.simulans**

$n = 5$  aligned sequences of length  $l = 500$

16 segregating sites,  $S = \frac{16}{500} = 0.032$

One non-synonymous polymorphism at site 142

find what is odd about 142

1	1	1	1	1	2	2	2	2	3	3	3	3	4	4	4
3	4	6	9	9	0	0	4	4	5	5	7	7	0	1	8
2	2	2	2	8	1	7	0	6	1	4	2	5	5	7	3
T	C	T	A	C	C	T	C	C	T	C	G	G	T	T	A
T	C	C	T	A	C	C	T	C	C	T	G	G	T	T	T
C	T	C	C	C	C	C	T	C	T	T	T	G	C	T	A
C	T	C	C	C	C	C	T	T	C	T	G	A	C	T	T
C	T	C	C	C	T	C	T	T	T	T	G	G	C	C	A

$\pi = \frac{79}{5000} = 0.0158$

$\bar{h} = \frac{6.32}{500} = 0.0126$ , same  $\pi = \frac{5}{4} \cdot 0.0126 = 0.0158$

configuration	(5,0)	(4,1)	(3,2)	(3,1,1)	tot
number of sites	484	9	6	1	500
number of pmm/site	0	4	6	7	
total number of pmm	0	36	36	7	79
$h_i$	0	0.32	0.48	0.56	
sum of $h_i$	0	2.88	2.88	0.56	6.32

## Infinite-sites model

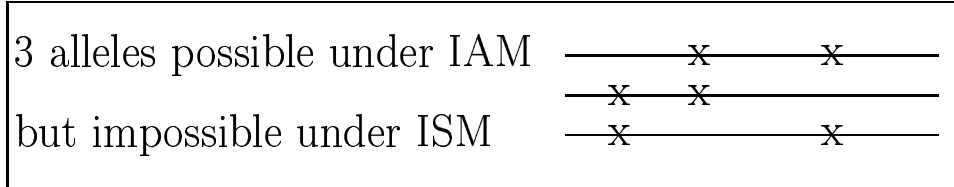
ISM is a narrower version of IAM assuming that

new mutations occur at sites not previously mutated

Number of mutations in the gene tree since MRCA

= number of alleles in IAM

= number of segregating sites in ISM



If ISM holds, then easier tree reconstruction

## Neutral mutation rate estimation

Consider  $n$  aligned sequences of length  $l$  assuming ISM

number of segregating sites  $l \cdot S \in \text{Bin}(2Nl \cdot J_n, \mu)$

$J_n$  = total branch length in the coalescent

$\mu$  = mutation rate per nucleotide site per generation

Two unbiased estimates of  $\theta$

$\hat{\theta} = S/a_1$  with  $E(\hat{\theta}) = \theta$  and  $\pi$  with  $E(\pi) = \theta$

$\hat{\theta}$  is consistent,  $\pi$  is inconsistent

$$\text{Var}(\hat{\theta}) = \frac{\theta}{la_1} + \frac{a_2\theta^2}{a_1^2}$$

$$\text{Var}(\pi) = \frac{b_1}{l}\theta + b_2\theta^2, \quad b_1 = \frac{n+1}{3(n-1)}, \quad b_2 = \frac{2(n^2+n+3)}{9n(n-1)}$$

Stochastic variance component

$$\lim_{n \rightarrow \infty} \text{Var}(\pi) = \frac{\theta}{3l} + \frac{2}{9}\theta^2$$

due to sequence dependence by common ancestry

Clustering effect of alleles

coalescent is dominated by  $T_2$ , two major clusters

positive covariation of pmm due to few major clusters

new sequences add little information

### **Ex 11: human effective population size**

mtDNA data: 21 humans of diverse origin

868 nucleotide sites with  $\pi = 0.0018$

no recombination, high mutation rate

Haploid maternal inheritance implies that

under neutrality  $\pi$  is close to  $\theta = 2N_f\mu = N_e\mu$

$N_f$  = effective population size for females

Mammalian mtDNA mutation rate

$5 \cdot 10^{-9}$  to  $10 \cdot 10^{-9}$  nucl. subst. per site per year

$\mu = 10^{-7}$  to  $2 \cdot 10^{-7}$  subst. per site per generation

human  $N_e = \frac{\theta}{\mu} = 9,000$  to  $18,000$

Fig 8.24, p. 364: star shaped tree, mitochondrial Eve

lived between 180,000 and 360,000 years ago in Africa

### **4.7 Synonymous and non-synonymous rates**

Genetic code is redundant Table 8.2, p. 339

three types of sites: 0 = non-degenerate site

2 = two-fold site and 4 = four-fold site

At a two-fold site $\frac{1}{3}$ of substitutions are synonymous
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Effective numbers of sites

$$l_s = l_4 + \frac{1}{3} \cdot l_2 \text{ and } l_n = l_0 + \frac{2}{3} \cdot l_2$$

$$\text{total length } l = l_0 + l_2 + l_4 = l_s + l_n$$

Fig 8.12, p. 341 and Fig 8.13, p. 342

different substitution rates  $\lambda_s = \frac{d_s}{2t}$  and  $\lambda_n = \frac{d_n}{2t}$

$$d_s = \frac{\text{synonymous changes}}{l_s} \text{ and } d_n = \frac{\text{nonsynonymous changes}}{l_n}$$

Usually  $\lambda_s > \lambda_n$  because of deleterious mutations

Fig 8.14, p. 343: mammalian nuclear DNA rates

Neutrality:  $\lambda_s = \lambda_n$ , positive selection:  $\lambda_s < \lambda_n$

## Genome averages

Wide variety of unconstrained substitution rates  $\lambda_s$

plant chloroplast DNA	$1 \cdot 10^{-9}$
mammalian nuclear DNA	$3.5 \cdot 10^{-9}$
plant nuclear DNA	$5 \cdot 10^{-9}$
E.coli and Salmonella enterica bacteria	$5 \cdot 10^{-9}$
Drosophila nuclear DNA	$1.5 \cdot 10^{-8}$
mammalian mitochondrial DNA	$5.7 \cdot 10^{-8}$
HIV-1	$6.6 \cdot 10^{-3}$
Influenza A virus	$1.3 \cdot 10^{-2}$

## Ex 2: bacterial gene

Observed differences per site

$$d_s = \frac{7}{10+12/3} = 0.5, \quad d_n = \frac{2}{38+12 \cdot 2/3} = 0.04$$

$$\text{uncorrected estimates } \tilde{\lambda}_s = 3.1 \cdot 10^{-9}, \quad \tilde{\lambda}_n = 0.3 \cdot 10^{-9}$$



## Positive selection evidence

in a study of 3595 groups of homologous sequences only  
17 groups with  $\lambda_n/\lambda_s$  significantly larger than 1  
many of these are sex-related genes (favor speciation)

In some immunoglobulin genes

$\lambda_n/\lambda_s > 1$  in certain regions

overdominant selection for antibody diversity

## 4.8 Two tests of neutrality

$H_0$ : observed polymorphism is due to selective neutrality  
of mutations and not due to natural selection

### McDonald-Kreitman test

Chi-square test of homogeneity comparing two pairs of  
numbers of (synonymous, non-synonymous) differences

1. fixed differences between species
2. within species polymorphic sites

Reject the null hypothesis of neutrality

if two distributions are significantly different

## Ex 12: G6PD gene in Drosophila

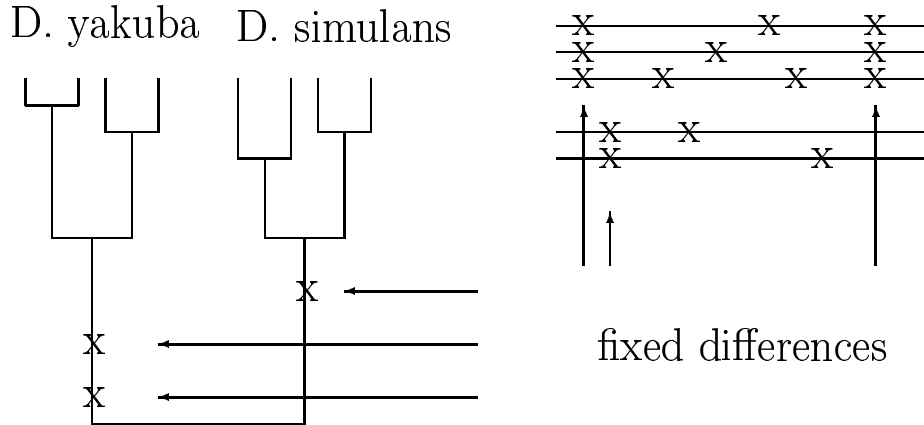
12 alleles in *D.yakuba* and 6 alleles in *D.simulans*

differences	between species	within species	total
synonymous	17(20.3)	29(25.7)	46
nonsynonymous	6(2.7)	0(3.3)	6
total	23	29	52

Excess of nonsynonymous fixed differences

positive selection of advantageous nonsyn. mutations

$$X^2 = 8.6, df = 1, \sqrt{8.6} = 2.93, P = 0.0034, \text{reject } H_0$$



### Tajima test

tests neutrality using polymorphisms in one species

compares two estimates of  $\theta$ :  $\hat{\theta} = S/a_1$  and  $\pi$

$S$  and  $\pi$  react differently on presence of selection

$S$  examines the number of polymorphic sites

$\pi$  assesses the site frequencies  $p_A, p_G, p_T, p_C$

Very unequal  $p_A, p_G, p_T, p_C$  imply smaller  $\pi$   
 almost equal  $p_A, p_G, p_T, p_C$  imply larger  $\pi$

### Ex 13: configuration and nucleotide diversity

$n = 12, l = 1$ , number of pairs of sequences  $\binom{12}{2} = 66$

config	(10,1,1,0)	(9,1,1,1)	(6,3,2,1)	(4,3,3,2)	(3,3,3,3)
#(pmm)	21	30	48	53	54
$\pi$	0.318	0.455	0.727	0.803	0.818

## Tajima test statistic

Under hypothesis of neutrality  $\text{Var}(\pi - \frac{S}{a_1}) = \frac{c_1\theta}{l} + c_2\theta^2$

where  $c_1 = b_1 - \frac{1}{a_1}$ ,  $c_2 = b_2 - \frac{n+2}{a_1n} + \frac{a_2}{a_1^2}$

$$D = \frac{\pi - S/a_1}{\sqrt{e_1 S + e_2 S(S-1/l)}}, \text{ where } e_1 = \frac{c_1}{a_1}, e_2 = \frac{c_2}{a_1^2 + a_2}$$

Null distribution of Tajima's  $D$  is tabulated by simulation  
might be approximated by a Beta distribution

Significant  $D > 0$  means almost equal  $p_A, p_G, p_T, p_C$ :  
either balancing selection (overdominance) or  
diversifying selection when rare alleles are favored

Significant  $D < 0$  means very unequal  $p_A, p_G, p_T, p_C$ :  
either selection against rare alleles or  
recent bottleneck implying reduced genetic variation

## 4.9 Recombination and polymorphism

Fig 5.9, p. 182: evolutionary benefit of recombination

Fig 5.10, p. 183: low recomb. rate  $\rightarrow$  low polymorphism

Hitchhiking

Fig 8.20, p. 355: hitchhiking (selective sweep) example  
advantageous mutation results in reduced  
number of segregating sites in tightly linked region

Background selection

reduced diversity at a neutral locus

tightly surrounded by many loci of harmful mutations