# Family Specific Rates of Protein Evolution

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Dissertation

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"Kollegen, wir sind ganz nahe dran, das Rätsel zu lösen", ignorierte Justus die Einwände des Dritten Detektivs. "Und das wird auch höchste Zeit, denn wir wissen immer noch nicht, wo Morton steckt und ob er vielleicht in Gefahr ist. Heute Abend werden wir uns ein weiteres Puzzleteil holen." Bob brachte beim Abendessen kaum einen Bissen herunter. Seine Eltern waren hocherfreut, dass er endlich mal wieder nach Hause kam, doch er enttäuschte sie durch seine Schweigsamkeit und die ständigen Blicke auf die Uhr. Aus: Die drei ???, Tödliche Spur

1	Intr	oductio	on 7
	1.1	Motiv	ation
	1.2	Overv	iew
	1.3	Ackno	weldgements
2	Pre	liminari	es 9
	2.1	Biolog	gical Background
		2.1.1	Cells
		2.1.2	Proteins
		2.1.3	DNA and gene transcription
		2.1.4	Protein synthesis and secretion
	2.2	Molec	ular Evolution
		2.2.1	Molecular Evolution
		2.2.2	Genome evolution
		2.2.3	Point Mutations
		2.2.4	Amino Acid Replacement
		2.2.5	Evolution of protein function
	2.3	Comp	utational Molecular Biology
		2.3.1	Pairwise sequence alignment
		2.3.2	Fast heuristic alignment, BLAST and FASTA
		2.3.3	Profiles, PSI-BLAST
		2.3.4	Hidden Markov Models
		2.3.5	Clustering homologous sequences
		2.3.6	Multiple sequence alignment
	2.4	Molec	ular Phylogenetics
		2.4.1	Inferring molecular phylogenies
		2.4.2	The molecular clock, ultrametric and additive trees 29
		2.4.3	Character- and distance based methods
		2.4.4	Non-parametric bootstrapping
		2.4.5	Markovian modeling of sequence evolution

3	Fan	ily spe	cific rates of protein evolution	41
	3.1	Rates	of protein evolution	41
	3.2	The d	ata, orthologous families and alignments	42
	3.3	The st	ubstitution model	44
	3.4	Comp	aring pairwise evolutionary distances	44
	3.5	Estim	ating family specific evolutionary rates	47
		3.5.1	The tree length ratio	47
		3.5.2	The Family Specific Rate (FSR)	48
		3.5.3	The Likelihood Ratio	48
	3.6	Result	ts	51
		3.6.1	FSR versus tree length	51
		3.6.2	Rate distribution	51
		3.6.3	Family Specific Rates and nonsynonymous nucleotide substitutions	
		3.6.4	Rates of essential genes, RNA interference	57
		3.6.5	Protein interaction and the rate of evolution	58
		3.6.6	Does protein function constrain the rate?	59
4	Pro	tein ev	olution, the younger the faster	63
	4.1	Metaz	coan radiation, the younger the faster?	63
	4.2	Extra-	-cellular proteins	64
		4.2.1	Inferring extra-cellular localization	64
		4.2.2	Modern extra-cellular proteins are fast evolving	65
		4.2.3	Evolution of protein tyrosine kinases (PTKs) and tyrosine kinase	
			receptors (rPTKs)	65
	4.3		ing the ancient origin of eukaryotic proteins	69
	4.4	Taxon	a-specific rate distributions	72
		4.4.1	Proteins evolved from primordial domains	72
		4.4.2	The least common taxon of a SYSTERS cluster	73
		4.4.3	The least common taxon according to domain architecture	74
		4.4.4	Taxon-specific rate distributions	74
		4.4.5	Metazoan radiation and the invention of extra-cellular proteins .	75
		4.4.6	The younger the faster?	77
	4.5	Multig	gene families	79
		4.5.1	Duplicated genes are more conserved	79
		4.5.2	"Young" and "old" multigene families	79
		4.5.3	Dating duplication events	82
5	Phy	logene	tic trees from multiple genes	89
	5.1	Inferri	ing genome phylogenies	89
	5.2		Path Length Ratio (PLR) method	90
	5.3		reighted Individual Protein (wIP) method	90
	5.4		ts	91

Contents	9
Contents	ა

6	Summary and conclusions	95
Bi	ibliography	98
Α	Scatter plots	111
В	Domain names	113
C	Complete prokaryotic proteomes	115
D	Erklärung zur Urheberschaft	117

## **Abbrevations and notations**

- BYr Billions of years
  - C Caenorhabditis elegans
  - D Drososphila melanogaster
- DNA Deoxyribonucleic acid
- EMP Evolutionary Markov Process
  - F Fugu rubripes
- FSR Family Specific Rate
  - H Homo sapiens
  - IP Individual Protein
- LCT Least common taxon
- LRT Likelihood ratio test
  - NJ Neighbor-Joining
  - ML Maximum likelihood
- mRNA Messenger RNA
  - PAM Point accepted mutation, percent accepted mutations
  - PNJ Profile Neighbor-Joining
  - PLR Path Length Ratio
  - PTK Protein Tyrosine Kinase
  - RNA Ribonucleic acid
  - RNAi RNA interference
  - rPTK Receptor protein tyrosine kinase
    - $\hat{\lambda}_i$  Family Specific Rate
    - $\hat{l}_i$  Tree Length Ratio
    - $t_i$  Evolutionary distances, edge lengths
    - $\tau_i$  Historical times
    - P Probability transition matrix
    - $\pi$  Stationary distribution
    - Pr Probability
    - $\mathcal{L}$  Likelihood
    - Q Rate matrix
    - T Tree topology
    - $d_N$  Number of nonsynonymous substitutions
    - $d_S$  Number of synonymous substitutions

## 1 Introduction

#### 1.1 Motivation

The advent of molecular sequence data affects the theory of evolution like a continuing revolution. Already in the 1960ies Kimura demonstrated having just a few amino acid sequences available that the rate of protein evolution is much too high to be solely explained by the logic of natural selection. According to Kimuras theory of neutral evolution the majority of molecular changes in evolution are randomly fixed.

Current large scale nucleic acid sequencing projects abundantly produce sequence data. Analyzing the data is the primary challenge and a prerequisite for a better understanding of the forces that drive evolutionary processes.

#### 1.2 Overview

In this thesis the rates of protein evolution are estimated and analyzed on a genomic scale for diverse eukaryotic model organisms. At first, Chapter 2 briefly reviews some basics of molecular biology and molecular evolution with a focus on topics that are relevant for the thesis. Methods, tools and information about certain database releases that were used and are referred to in the thesis are described in Section 2.3. Markov models of sequence evolution play a central role in the thesis. The basics of Markovian models that are used to model sequence evolution and to estimate evolutionary rates are reviewed in Section 2.4.5.

Chapter 3 empirically documents that rate variations among proteins are mainly driven by family specific effects. The measure of a family specific rate is meant to describe the slow or fast evolution of a gene family and averages over lineage specific rate variations. Having derived an overall rate distribution, the prevalent assumption that essential genes are more evolutionarily conserved than nonessential ones is put forward and supported.

The observation that modern extra-cellular proteins are subject to a rapid accumulation of mutations suggests the following hypothesis: Selective constraints act weaker and evolutionary rates are larger the more recent a protein emerged in evolution. Chapter 4 describes the experiments that were performed to investigate the hypothesis.

In Chapter 5 two methods to infer an organismal phylogenetic tree are proposed and applied. Both methods account for rate variations among gene families.

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