



# Lecture Notes in Statistics

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# Lecture Notes in Statistics

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Asymptotic Optimal  
Inference for  
Non-ergodic Models

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## PREFACE

This monograph contains a comprehensive account of the recent work of the authors and other workers on large sample optimal inference for non-ergodic models. The non-ergodic family of models can be viewed as an extension of the usual Fisher-Rao model for asymptotics, referred to here as an ergodic family. The main feature of a non-ergodic model is that the sample Fisher information, appropriately normed, converges to a non-degenerate random variable rather than to a constant. Mixture experiments, growth models such as birth processes, branching processes, etc., and non-stationary diffusion processes are typical examples of non-ergodic models for which the usual asymptotics and the efficiency criteria of the Fisher-Rao-Wald type are not directly applicable. The new model necessitates a thorough review of both technical and qualitative aspects of the asymptotic theory. The general model studied includes both ergodic and non-ergodic families even though we emphasise applications of the latter type.

The plan to write the monograph originally evolved through a series of lectures given by the first author in a graduate seminar course at Cornell University during the fall of 1978, and by the second author at the University of Munich during the fall of 1979. Further work during 1979-1981 on the topic has resolved many of the outstanding conceptual and technical difficulties encountered previously. While there are still some gaps remaining, it appears that the mainstream development in the area has now taken a more definite shape.

The introductory Chapter 0 gives an over-view of the main results in an informal setting. Chapters 1 and 2 then develop the new model and the related estimation theory more formally. Proofs of most of the results are included although we have tried to avoid heavy technicalities and over-generalisation. Chapters 3 and 4 are concerned

with asymptotic tests for non-ergodic models and specific applications to mixture experiments. A more discursive treatment is given in these chapters although proofs of the main results are included. Chapter 5 is a brief introduction to non-local results. Finally, the appendices contain some relevant information on uniform convergence, and contiguity.

All references to the main sources are relegated to a final section in each chapter, except in Chapter 0 which contains a descriptive and partly historical account of the results.

A systematic treatment of Bayes, non-parametric and sequential methods for the non-ergodic family would be of interest. These topics are open for future research at the time of writing.

The book *Statistical Inference for Stochastic Processes* by Basawa and Prakasa Rao, Academic Press (1980), provides a background and collateral reference material for some of the topics treated. It is not however a superfluous prerequisite for reading this monograph.

There are a number of people we would like to thank for their assistance: Dr. P. Jeganathan kindly sent us a copy of his Ph.D. thesis and pre-prints of his work; Dr. A. R. Swenson also kindly provided us with a copy of his thesis and a pre-print of a paper; Dr. T. J. Sweeting helped us in correspondence concerning the subject, sent us a pre-print of a paper and suggested changes to the original draft; Dr. P. D. Feigin helped us greatly by carefully reading the original draft and providing numerous corrections and suggestions. We would like to thank Judy Stewart for her excellent typing of both drafts of the work and Irene Hudson and Richard Huggins for proof-reading the original typescript

### NOTATION

The following notation and abbreviations are used throughout.

$\S, \S\S$	section, sections
$\mathbb{R}^k$	$k$ -dimensional Euclidean space
$\mathbb{B}^k$	the $k$ -dimensional Borel sets
$\mu_k$	$k$ -dimensional Lebesgue measure

These definitions apply for  $k = \infty$  also. When  $k = 1$  it is omitted.

$B^C$	the complement of the set $B$
$\bar{B}$	the closure of the set $B$
$\partial B$	the boundary of the set $B$ ; $B = \bar{B} \cap \bar{B}^C$
$\chi(A)$	the indicator function of the set $A$ ;  $\chi(A)(\omega) = \begin{cases} 1 & \omega \in A \\ 0 & \omega \notin A \end{cases}$
$A \times B$	for $\sigma$ -fields $A$ and $B$ , the product $\sigma$ -field
$\ a_{ij}\ _{i,j=1}^{k,l}$	the $(k \times l)$ matrix with $(i,j)$ -entry $a_{ij}$
$\text{diag}\ a_i\ _{i=1}^k$	the $(k \times k)$ diagonal matrix with $i$ th diagonal entry $a_i$
$\text{diag}\{a_1, a_2, \dots, a_k\}$	same as $\text{diag}\ a_i\ _{i=1}^k$
$\text{tr}(A)$	the trace of the matrix $A$
$x^T$	the transpose of the vector or matrix $x$
$ A $	for a matrix $A$ , the matrix norm;  $ A  = \{\text{tr}(A^T A)\}^{1/2}$
$A_n \rightarrow 0$	for a sequence of matrices $\{A_n\}$  convergence in the metric given by the matrix norm
$ a $	for a vector $a$ , the Euclidean norm

$a_n \rightarrow 0$	for a sequence of vectors $\{a_n\}$ , convergence in the Euclidean metric
p.d.	positive definite
$L(X P)$ or $L(X)$	the distribution or law of the random variable or vector $X$ when the probability measure is $P$ ; when $P$ is omitted simply the law or distribution of $X$
$F_X(\cdot)$	the distribution function of the random variable or vector $X$ when the argument is an (extended) real number or vector; the associated measure when the argument is a Borel set
i.i.d.	is distributed as independent and identically distributed
$N(\mu, \Sigma)$	the multivariate normal distribution with mean vector $\mu$ and variance matrix $\Sigma$
$N(\mu, \sigma^2)$	the normal distribution with mean $\mu$ and variance $\sigma^2$
$E_\theta$	expectation when the underlying probability measure is $P_\theta$
$\text{var}_\theta$	variance when the underlying probability measure is $P_\theta$
$P * Q$	the convolution of the two measures $P$ and $Q$
$\ P-Q\ $	the $L_1$ -norm of $P - Q$ for the two probability measures $P$ and $Q$ on $(\Omega, \mathcal{A})$ defined by $\ P-Q\  = 2 \sup\{ P(A)-Q(A) ; A \in \mathcal{A}\}$



$\frac{dP}{dQ}$	the Radon-Nikodym derivative of $P$ with respect to $Q$
a.c.	absolutely continuous
$\Rightarrow$	convergence in distribution or law or weak convergence
$\xrightarrow{P}$	convergence in probability
$\xrightarrow{L_2}$	convergence in mean square
$\xrightarrow{a.s.}$	almost sure convergence

The subscript  $c$  on a convergence symbol (e.g.  $\Rightarrow_c$ ) indicates continuous convergence. The subscript  $u$  (e.g.  $\Rightarrow_u$ ) denotes uniform convergence on all compact subsets. For a discussion of these concepts see Appendix (A.1).

$o_p(1)$	a term which converges to zero in probability
a.s.	almost surely
MLE	maximum likelihood estimator
LR	likelihood ratio
LAN	locally asymptotically normal
LAMN	locally asymptotically mixed normal
ULAMN	uniform locally asymptotically mixed normal
u.m.p. (u.)	uniformly most powerful (unbiased).

## CONTENTS

### Chapter 0. An Over-view

1. Introduction	1
2. The Classical Fisher-Rao Model for Asymptotic Inference	4
3. Generalisation of the Fisher-Rao Model to Non-ergodic Type Processes	11
4. Mixture Experiments and Conditional Inference	18
5. Non-local Results	21

### Chapter 1. A General Model and Its

#### Local Approximation

1. Introduction	22
2. LAMN Families	22
3. Consequences of the LAMN Condition	25
4. Sufficient Conditions for the LAMN Property	31
5. Asymptotic Sufficiency	38
6. An Example (Galton-Watson Branching Process)	41
7. Bibliographical Notes	43

### Chapter 2. Efficiency of Estimation

1. Introduction	45
2. Asymptotic Structure of Limit Distributions of Sequences of Estimators	46
3. An Upper Bound for the Concentration	51
4. The Existence and Optimality of the Maximum Likelihood Estimators	56

5. Optimality of Bayes Estimators	64
6. Bibliographical Notes	67

Chapter 3. Optimal Asymptotic Tests

1. Introduction	68
2. The Optimality Criteria: Definitions	68
3. An Efficient Test of Simple Hypotheses: Contiguous Alternatives	71
4. Local Efficiency and Asymptotic Power of the Score Statistic	74
5. Asymptotic Power of the Likelihood Ratio Test: Simple Hypothesis	77
6. Asymptotic Powers of the Score and LR Statistics for Composite Hypotheses with Nuisance Parameters	83
7. An Efficient Test of Composite Hypotheses with Contiguous Alternatives	88
8. Examples	94
9. Bibliographical Notes	102

Chapter 4. Mixture Experiments and  
Conditional Inference

1. Introduction	103
2. Mixture of Exponential Families	104
3. Some Examples	105
4. Efficient Conditional Tests with Reference to $L$	109
5. Efficient Conditional Tests with Reference to $\bar{L}$	114
6. Efficient Conditional Tests with Reference to $L^C$ : Bahadur Efficiency	118

7. Efficiency of Conditional Maximum Likelihood Estimators	121
8. Conditional Tests for Markov Sequences and Their Mixtures	125
9. Some Heuristic Remarks about Conditional Inference for the General Model	128
10. Bibliographical Notes	130

Chapter 5. Some Non-local Results

1. Introduction	131
2. Non-local Behaviour of the Likelihood Ratio	131
3. Examples	133
4. Non-local Efficiency Results for Simple Likelihood Ratio Tests	141
5. Bibliographical Notes	143

Appendices

A.1 Uniform and Continuous Convergence	145
A.2 Contiguity of Probability Measures	151

<u>References</u>	161
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