**SpringerBriefs in Statistics**USS Research Series in Statistics

Taka-aki Shiraishi



# Multiple Comparisons for Bernoulli Data





### SpringerBriefs in Statistics

### **JSS Research Series in Statistics**

#### **Editors-in-Chief**

Naoto Kunitomo, The Institute of Mathematical Statistics, Tachikawa, Tokyo, Japan Akimichi Takemura, The Center for Data Science Education and Research, Shiga University, Hikone, Shiga, Japan

### **Series Editors**

Genshiro Kitagawa, Meiji Institute for Advanced Study of Mathematical Sciences, Nakano-ku, Tokyo, Japan

Shigeyuki Matsui, Graduate School of Medicine, Nagoya University, Nagoya, Aichi, Japan

Manabu Iwasaki, School of Data Science, Yokohama City University, Yokohama, Kanagawa, Japan

Yasuhiro Omori, Graduate School of Economics, The University of Tokyo, Bunkyo-ku, Tokyo, Japan

Masafumi Akahira, Institute of Mathematics, University of Tsukuba, Tsukuba, Ibaraki, Japan

Masanobu Taniguchi, School of Fundamental Science and Engineering, Waseda University, Shinjuku-ku, Tokyo, Japan

Hiroe Tsubaki, The Institute of Statistical Mathematics, Tachikawa, Tokyo, Japan Satoshi Hattori, Faculty of Medicine, Osaka University, Suita, Osaka, Japan Kosuke Oya, School of Economics, Osaka University, Toyonaka, Osaka, Japan Taiji Suzuki, School of Engineering, University of Tokyo, Tokyo, Japan

The current research of statistics in Japan has expanded in several directions in line with recent trends in academic activities in the area of statistics and statistical sciences over the globe. The core of these research activities in statistics in Japan has been the Japan Statistical Society (JSS). This society, the oldest and largest academic organization for statistics in Japan, was founded in 1931 by a handful of pioneer statisticians and economists and now has a history of about 80 years. Many distinguished scholars have been members, including the influential statistician Hirotugu Akaike, who was a past president of JSS, and the notable mathematician Kiyosi Itô, who was an earlier member of the Institute of Statistical Mathematics (ISM), which has been a closely related organization since the establishment of ISM. The society has two academic journals: the Journal of the Japan Statistical Society (English Series) and the Journal of the Japan Statistical Society (Japanese Series). The membership of JSS consists of researchers, teachers, and professional statisticians in many different fields including mathematics, statistics, engineering, medical sciences, government statistics, economics, business, psychology, education, and many other natural, biological, and social sciences. The JSS Series of Statistics aims to publish recent results of current research activities in the areas of statistics and statistical sciences in Japan that otherwise would not be available in English; they are complementary to the two JSS academic journals, both English and Japanese. Because the scope of a research paper in academic journals inevitably has become narrowly focused and condensed in recent years, this series is intended to fill the gap between academic research activities and the form of a single academic paper. The series will be of great interest to a wide audience of researchers, teachers, professional statisticians, and graduate students in many countries who are interested in statistics and statistical sciences, in statistical theory, and in various areas of statistical applications.

More information about this subseries at https://link.springer.com/bookseries/13497

### Taka-aki Shiraishi

## Multiple Comparisons for Bernoulli Data



Taka-aki Shiraishi Faculty of Science and Technology Nanzan University Nagoya, Aichi, Japan

ISSN 2191-544X ISSN 2191-5458 (electronic)
SpringerBriefs in Statistics
ISSN 2364-0057 ISSN 2364-0065 (electronic)
JSS Research Series in Statistics
ISBN 978-981-19-2707-2 ISBN 978-981-19-2708-9 (eBook)
https://doi.org/10.1007/978-981-19-2708-9

© The Author(s), under exclusive license to Springer Nature Singapore Pte Ltd. 2022

This work is subject to copyright. All rights are solely and exclusively licensed by the Publisher, whether the whole or part of the material is concerned, specifically the rights of translation, reprinting, reuse of illustrations, recitation, broadcasting, reproduction on microfilms or in any other physical way, and transmission or information storage and retrieval, electronic adaptation, computer software, or by similar or dissimilar methodology now known or hereafter developed.

The use of general descriptive names, registered names, trademarks, service marks, etc. in this publication does not imply, even in the absence of a specific statement, that such names are exempt from the relevant protective laws and regulations and therefore free for general use.

The publisher, the authors and the editors are safe to assume that the advice and information in this book are believed to be true and accurate at the date of publication. Neither the publisher nor the authors or the editors give a warranty, expressed or implied, with respect to the material contained herein or for any errors or omissions that may have been made. The publisher remains neutral with regard to jurisdictional claims in published maps and institutional affiliations.

This Springer imprint is published by the registered company Springer Nature Singapore Pte Ltd. The registered company address is: 152 Beach Road, #21-01/04 Gateway East, Singapore 189721, Singapore

### **Preface**

Multiple tests and simultaneous confidence intervals specify differences in means. Tukey (1953), Miller (1981), Hochberg and Tamhane (1987), Hsu (1996), and Shiraishi et al. (2018), (2019) are some technical books on multiple comparisons for continuous random variables. Multiple comparisons for discrete random variables have been discussed a little. The present book focuses on progressive multiple comparisons of proportions in multi-sample models with Bernoulli responses.

In Chap. 1, we give theoretical basics in one-sample and two-sample models. We state regurarity conditions of exact confidence limit using F-distribution. We introduce asymptotic theory based on variance-stabilizing transformation. In Chap. 2, we give simultaneous inference for all proportions in multi-sample models by using the exact confidence limit and the asymptotic theory. In Chap. 3, we discuss allpairwise multiple comparison tests of proportions. Closed testing procedures based on maximum absolute values of some two-sample test statistics and based on  $\chi^2$ -test statistics are introduced in multi-sample models. The results suggest that the multistep procedures are more effective than single-step procedures and the Ryan–Einot– Gabriel-Welsch (REGW) type tests. In Chap. 4, we give multiple comparison test procedures with a control. In Chap. 5, we propose simultaneous confidence intervals for difference of proportions, odds ratio, and ratio of proportions. By the theory of this intervals, we are able to obtain all-pairwise multiple comparison tests of odds ratio. In Chaps. 6 and 7, under simple ordered restrictions of proportions, we also discuss closed testing procedures based on maximum values of two-sample one-sided test statistics and based on Bartholomew's  $\bar{\chi}^2$ -statistics. Although single-step multiple comparison procedures are utilized in general, the closed testing procedures stated in the present book are fairly more powerful than the single-step procedures. Bretz et al. (2011) discuss serial gatekeeping methods based on Bonferroni inequality.

vi Preface

In Chaps. 8 and 9, we propose serial gatekeeping methods based on the closed testing procedures stated in Chaps. 3, 4, 6 and 7. It is shown that the proposed serial gatekeeping methods are much superior to the serial gatekeeping methods based on Bonferroni tests.

Nagoya, Japan March 2022 Taka-aki Shiraishi

### References

Bretz F, Hothorn T, Westfall P (2010) Multiple comparisons using R. Chapman & Hall Hochberg Y, Tamhane AC (1987) Multiple comparison procedures. Wiley Hsu JC (1996) Multiple comparisons-theory and methods. Chapman & Hall Miller RG (1981) Simultaneous statistical inference. 2rd edn. Springer

Shiraishi T, Sugiura H (2018) Theory of multiple comparison procedures and its computation. Kyoritsu-Shuppan Co., Ltd. (in Japanese)

Shiraishi T, Sugiura H, Matsuda S (2019) Pairwise multiple comparisons-theory and computation. SpringerBriefs. Springer International Publishing

Tukey JW (1953). The problem of multiple comparisons. The Collected Works of John W. Tukey (1994), Volume VIII: Multiple Comparisons. Chapman & Hall

## Acknowledgements

The authors are grateful to two referees for valuable comments. This research was supported in part by a Grant-in-Aid for Co-operative Research (C) 18K11204 from the Japanese Ministry of Education. This research was also supported in part by Nanzan University Pache Research Subsidy I-A-2 for 2021 academic year.

### **Contents**

1	1 ne	oretical Basics in One-Sample and Two-Sample Models	
	1.1	Exact Theory in One-Sample Model	
	1.2	Asymptotic Theory in One-Sample Model	
	1.3	Asymptotic Theory in Two-Sample Model	1
	Refe	erences	1′
2	Sim	ultaneous Inference for All Proportions	1
	2.1	Multi-sample Models	1
	2.2	Exact Conservative Procedures	2
		2.2.1 Single-Step Methods	2
		2.2.2 Multi-step Methods	2
	2.3	Asymptotic Theory	2
		2.3.1 Single-Step Methods	2
		2.3.2 Sequentially Rejective Multiple Test Procedures	2
	Refe	rences	2
3	All-	Pairwise Comparison Tests	3
	3.1	Introduction	3
	3.2	Single-Step Test Procedures	3
	3.3	Closed Testing Procedures	3:
	Refe	rences	4
4	Mul	tiple Comparison Tests with a Control	4
	4.1	Introduction	4
	4.2	The Single-Step Procedures	4
	4.3	Closed Testing Procedures	4
	Refe	rences	5
5	Sim	ultaneous Confidence Intervals	5:
	5.1	Introduction	5
	5.2	Pairwise Differences of Proportions Based on Arcsine	
		Transformation	5
	5.3	All-Pairwise Differences of Proportions	5

x Contents

		rence		
6		Pairwise Comparisons Under Simple Order Restrictions		
	6.1	Introduction		
	6.2	$\bar{\chi}^2$ -Test		
	6.3	Single-Step Procedures		
	6.4	Closed Testing Procedures		
	Refe	rences		
•	Comparisons with a Control and Successive Comparisons			
	Und	er Simple Order Restrictions		
	7.1	Introduction		
	7.2	Multiple Comparison Tests with a Control		
	7.3	Successive Comparisons Between Ordered Proportions		
	Refe	rences		
3	Hybrid Serial Gatekeeping Procedures for All-Pairwise			
		parisons		
	8.1	Introduction		
	8.2	Multiple Comparisons Under Unrestricted Proportions		
		in the <i>r</i> -th Multi-sample Model		
	8.3	Comparisons Under Order Restricted Proportions in the <i>r</i> -th		
		Multi-sample Model		
	8.4	Serial Gatekeeping Procedures		
	8.5	Application to Multivariate Multi-sample Models		
	8.6	Discussion		
		rences		
)	Hybrid Serial Gatekeeping Procedures for Multiple			
		parisons with a Control		
	9.1	Introduction		
	9.2	Multiple Comparisons Under Unrestricted Proportions		
	J. <u>2</u>	in the <i>r</i> -th Multi-sample Model		
	9.3	Comparisons Under Order Restricted Proportions in the $r$ -th		
	7.5	Multi-sample Model		
	9.4	Serial Gatekeeping Procedures		
	9.4	Application to Multivariate Multi-sample Models		