Stata for the Behavioral Sciences

Michael N. Mitchell



A Stata Press Publication STATA CORPORATION College Station, Texas



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Published by Stata Press, 4905 Lakeway Drive, College Station, Texas 77845 Typeset in \LaTeX 2 ε Printed in the United States of America

10 9 8 7 6 5 4 3 2 1

ISBN-10: 1-59718-173-0 ISBN-13: 978-1-59718-173-0

Library of Congress Control Number: 2015947163

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Contents

	\mathbf{Ack}	$\mathbf{nowledg}$	gments	V
	\mathbf{List}	of table	es xxii	ίi
	List of figures			v
	Pre	face	xxx	i
Ι	Wa	rming	up	1
1	\mathbf{Intr}	oductio	n :	3
	1.1	Read n	ne first!	4
		1.1.1	Downloading the example datasets and programs	4
		1.1.2	Other user-written programs	4
			The fre command	4
			The esttab command	5
			The extremes command	5
	1.2	Why us	se Stata?	5
		1.2.1	ANOVA	5
		1.2.2	Supercharging your ANOVA	8
		1.2.3	Stata is economical	8
		1.2.4	Statistical powerhouse	8
		1.2.5	Easy to learn	9
		1.2.6	Simple and powerful data management	0
		1.2.7	Access to user-written programs	0
		1.2.8	Point and click or commands: Your choice	1
		1.2.9	Powerful yet simple	1
		1.2.10	Access to Stata source code	1

viii Contents

		1.2.11	Online resources for learning Stata	11
		1.2.12	And yet there is more!	13
	1.3	Overvie	ew of the book	13
		1.3.1	Part I: Warming up	13
		1.3.2	Part II: Between-subjects ANOVA models	13
		1.3.3	Part III: Repeated measures and longitudinal models	14
		1.3.4	Part IV: Regression models	15
		1.3.5	Part V: Stata overview	15
		1.3.6	The GSS dataset	16
		1.3.7	Language used in the book	17
		1.3.8	Online resources for this book	19
	1.4	Recomm	mended resources and books	19
		1.4.1	Getting started	19
		1.4.2	Data management in Stata	20
		1.4.3	Reproducing your results	20
		1.4.4	Recommended Stata Press books	21
2	\mathbf{Desc}	riptive	statistics	23
	2.1	Chapte	r overview	23
	2.2	Using a	and describing the GSS dataset	23
	2.3	One-wa	y tabulations	26
	2.4	Summa	ry statistics	31
	2.5	Summa	ry statistics by one group	32
	2.6	Two-wa	ay tabulations	34
	2.7	Cross-ta	abulations with summary statistics	37
	2.8	Closing	thoughts	37
3	Basic	infere	ntial statistics	39
	3.1	Chapte	r overview	39
	3.2	Two-sa	mple t tests	40
	3.3	Paired s	sample t tests	42
	3.4	One-sar	mple t tests	43

Cont	tents			ix	
	3.5	Two-sa	mple test of proportions	43	
	3.6	One-sai	mple test of proportions	46	
	3.7	Chi-squ	nared and Fisher's exact test	48	
	3.8	Correla	tions	50	
	3.9	Immedi	iate commands	51	
		3.9.1	Immediate test of two means	51	
		3.9.2	Immediate test of one mean	52	
		3.9.3	Immediate test of two proportions	53	
		3.9.4	Immediate test of one proportion	53	
		3.9.5	Immediate cross-tabulations	54	
	3.10	Closing	thoughts	56	
II	Bety	ween-s	subjects ANOVA models	57	
4	One-way between-subjects ANOVA				
	4.1	Chapte	er overview	59	
	4.2	Compa	ring two groups using a t test	59	
	4.3	Compa	ring two groups using ANOVA	63	
		4.3.1	Computing effect sizes	67	
	4.4	Compa	ring three groups using ANOVA	69	
		4.4.1	Testing planned comparisons using contrast	72	
		4.4.2	Computing effect sizes for planned comparisons	75	
	4.5	Estima	tion commands and postestimation commands	77	
	4.6	Interpr	eting confidence intervals	82	
	4.7	Closing	thoughts	84	
5	Cont	rasts fo	or a one-way ANOVA	85	
	5.1	Chapte	er overview	85	
	5.2	Introdu	icing contrasts	86	
		5.2.1	Computing and graphing means	88	
		5.2.2	Making contrasts among means	89	
		5.2.3	Graphing contrasts	90	

x Contents

		5.2.4	Options with the margins and contrast commands	92
		5.2.5	Computing effect sizes for contrasts	96
		5.2.6	Summary	98
	5.3	Overvie	ew of contrast operators	98
	5.4	Compar	re each group against a reference group	99
		5.4.1	Selecting a specific contrast	100
		5.4.2	Selecting a different reference group	101
		5.4.3	Selecting a contrast and reference group	101
	5.5	Compar	re each group against the grand mean	102
		5.5.1	Selecting a specific contrast	104
	5.6	Compar	re adjacent means	105
		5.6.1	Reverse adjacent contrasts	108
		5.6.2	Selecting a specific contrast	109
	5.7	Compar	ring with the mean of subsequent and previous levels	111
		5.7.1	Comparing with the mean of previous levels	115
		5.7.2	Selecting a specific contrast	116
	5.8	Polynor	mial contrasts	117
	5.9	Custom	contrasts	120
	5.10	Weighte	ed contrasts	123
	5.11	Pairwis	e comparisons	125
	5.12	Closing	thoughts	133
6	Anal	ysis of	covariance	135
	6.1	Chapter	r overview	135
	6.2	Exampl	le 1: ANCOVA with an experiment using a pretest	136
	6.3	Exampl	e 2: Experiment using covariates	142
	6.4	Exampl	le 3: Observational data	146
		6.4.1	Model 1: No covariates	147
		6.4.2	Model 2: Demographics as covariates	148
		6.4.3	Model 3: Demographics, socializing as covariates	148
		6.4.4	Model 4: Demographics, socializing, health as covariates $$	150

Contents xi

	6.5	Some to	echnical details about adjusted means
		6.5.1	Computing adjusted means: Method 1 15
		6.5.2	Computing adjusted means: Method 2 15
		6.5.3	Computing adjusted means: Method 3 15
		6.5.4	Differences between method 2 and method 3 15
		6.5.5	Adjusted means: Summary
	6.6	Closing	thoughts
7	Two	-way fac	ctorial between-subjects ANOVA 16
	7.1	Chapte	r overview
	7.2	Two-by	r-two models: Example 1
		7.2.1	Simple effects
		7.2.2	Estimating the size of the interaction
		7.2.3	More about interaction
		7.2.4	Summary
	7.3	Two-by	r-three models
		7.3.1	Example 2
			Simple effects
			Simple contrasts
			Partial interaction
			Comparing optimism therapy with traditional therapy 17
		7.3.2	Example 3
			Simple effects
			Partial interactions
		7.3.3	Summary
	7.4	Three-b	by-three models: Example 4
		7.4.1	Simple effects
		7.4.2	Simple contrasts
		7.4.3	Partial interaction
		7.4.4	Interaction contrasts
		7 1 5	Summary 10

xii	Contents

	7.5	Unbala	nced designs	193
	7.6	Interpr	eting confidence intervals	198
	7.7	Closing	thoughts	200
8	Anal	ysis of	covariance with interactions	203
	8.1	Chapte	r overview	203
	8.2	Examp	le 1: IV has two levels	206
		8.2.1	Question 1: Treatment by depression interaction	210
		8.2.2	Question 2: When is optimism the rapy superior?	213
		8.2.3	Example 1: Summary	219
	8.3	Examp	le 2: IV has three levels	220
		8.3.1	Questions 1a and 1b	225
			Question 1a	225
			Question 1b	226
		8.3.2	Questions 2a and 2b	227
			Question 2a	227
			Question 2b	228
		8.3.3	Overall interaction	230
		8.3.4	Example 2: Summary	231
	8.4	Closing	thoughts	231
9	Thre	e-way l	petween-subjects analysis of variance	233
	9.1	Chapte	r overview	233
	9.2	Two-by	r-two-by-two models	234
		9.2.1	Simple interactions by season	236
		9.2.2	Simple interactions by depression status	237
		9.2.3	Simple effects	239
	9.3	Two-by	r-two-by-three models	240
		9.3.1	Simple interactions by depression status	242
		9.3.2	Simple partial interaction by depression status	242
		9.3.3	Simple contrasts	244
		9.3.4	Partial interactions	244

Contents	xiii
Contents	AIII

	9.4	Three-b	by-three-by-three models and beyond	246
		9.4.1	Partial interactions and interaction contrasts	248
		9.4.2	Simple interactions	252
		9.4.3	Simple effects and simple contrasts	256
	9.5	Closing	thoughts	257
10	Supe	ercharge	e your analysis of variance (via regression)	259
	10.1	Chapte	r overview	259
	10.2	Perform	ning ANOVA tests via regression	260
	10.3	Superch	narging your ANOVA	264
		10.3.1	Complex surveys	265
		10.3.2	Homogeneity of variance	269
		10.3.3	Robust regression	273
		10.3.4	Quantile regression	275
	10.4	Main ef	ffects with interactions: anova versus regress	276
	10.5	Closing	thoughts	280
11	Powe	er analy	rsis for analysis of variance and covariance	281
	11.1	Chapte	r overview	281
	11.2	Power a	analysis for a two-sample t test	282
		11.2.1	Example 1: Replicating a two-group comparison	282
		11.2.2	Example 2: Using standardized effect sizes	284
		11.2.3	Estimating effect sizes	286
		11.2.4	Example 3: Power for a medium effect	287
		11.2.5	Example 4: Power for a range of effect sizes	288
		11.2.6	Example 5: For a given N, compute the effect size	290
		11.2.7	Example 6: Compute effect sizes given unequal Ns $\ \ldots \ \ldots$	291
	11.3	Power a	analysis for one-way ANOVA	293
		11.3.1	Overview	293
			Hypothesis 1. Traditional therapy versus control \dots .	293
			Hypothesis 2: Optimism therapy versus control	294

xiv Contents

		Hypothesis 3: Optimism therapy versus traditional therapy	294
		Summary of hypotheses	295
		11.3.2 Example 7: Testing hypotheses 1 and 2	295
		11.3.3 Example 8: Testing hypotheses 2 and 3	298
		11.3.4 Summary	301
	11.4	Power analysis for ANCOVA	301
		11.4.1 Example 9: Using pretest as a covariate	301
		11.4.2 Example 10: Using correlated variables as covariates \dots	303
	11.5	Power analysis for two-way ANOVA	306
		11.5.1 Example 11: Replicating a two-by-two analysis	306
		11.5.2 Example 12: Standardized simple effects	307
		11.5.3 Example 13: Standardized interaction effect	309
		11.5.4 Summary: Power for two-way ANOVA	309
	11.6	Closing thoughts	310
	_		
	Dan	sected measures and longitudinal designs	11
III	-	9	811
111 12	Repe	eated measures designs	313
	Repe	eated measures designs Chapter overview	313 313
	Reper 12.1 12.2	eated measures designs Chapter overview	313 313 314
	Repe 12.1 12.2 12.3	chapter overview	313 313 314 319
	Reper 12.1 12.2 12.3 12.4	chapter overview	313 313 314 319 324
	Repe 12.1 12.2 12.3 12.4 12.5	chapter overview	313 314 319 324 329
	Reper 12.1 12.2 12.3 12.4 12.5 12.6	chapter overview	313 314 319 324 329 331
	Reper 12.1 12.2 12.3 12.4 12.5 12.6 12.7	Chapter overview	313 313 314 319 324 329 331 333
	Repe 12.1 12.2 12.3 12.4 12.5 12.6 12.7 12.8	Chapter overview	313 314 319 324 329 331 333 337
12	Repe 12.1 12.2 12.3 12.4 12.5 12.6 12.7 12.8 12.9	Chapter overview	313 313 314 319 324 329 331 333 337 341
	Repe 12.1 12.2 12.3 12.4 12.5 12.6 12.7 12.8 12.9 Long	Chapter overview Example 1: One-way within-subjects designs Example 2: Mixed design with two groups Example 3: Mixed design with three groups Comparing models with different residual covariance structures Example 1 revisited: Using compound symmetry Example 1 revisited again: Using small-sample methods An alternative analysis: ANCOVA Closing thoughts gitudinal designs	313 314 319 324 329 331 337 341 343
12	Repe 12.1 12.2 12.3 12.4 12.5 12.6 12.7 12.8 12.9 Long	Chapter overview Example 1: One-way within-subjects designs Example 2: Mixed design with two groups Example 3: Mixed design with three groups Comparing models with different residual covariance structures Example 1 revisited: Using compound symmetry Example 1 revisited again: Using small-sample methods An alternative analysis: ANCOVA Closing thoughts gitudinal designs Chapter overview	313 314 319 324 329 331 333 337 341 343
12	Repe 12.1 12.2 12.3 12.4 12.5 12.6 12.7 12.8 12.9 Long	Chapter overview Example 1: One-way within-subjects designs Example 2: Mixed design with two groups Example 3: Mixed design with three groups Comparing models with different residual covariance structures Example 1 revisited: Using compound symmetry Example 1 revisited again: Using small-sample methods An alternative analysis: ANCOVA Closing thoughts gitudinal designs Chapter overview Example 1: Linear effect of time	313 314 319 324 329 331 337 341 343

	13.4	Examp	le 3: Piecewise modeling of time	356
	13.5	Examp	le 4: Piecewise effects of time by a categorical predictor	363
		13.5.1	Baseline slopes	367
		13.5.2	Treatment slopes	368
		13.5.3	Jump at treatment	370
		13.5.4	Comparisons among groups at particular days	372
		13.5.5	Summary of example 4	375
	13.6	Closing	thoughts	376
IV	Reg	ression	n models 3	377
14	Simp	ole and	multiple regression	379
	14.1	Chapte	r overview	379
	14.2	Simple	linear regression	380
		14.2.1	Decoding the output	382
		14.2.2	Computing predicted means using the margins command .	383
		14.2.3	Graphing predicted means using the marginsplot command	386
	14.3	Multipl	le regression	389
		14.3.1	Describing the predictors	390
		14.3.2	Running the multiple regression model	391
		14.3.3	Computing adjusted means using the margins command $\ .$.	392
		14.3.4	Describing the contribution of a predictor $\dots \dots$	394
			One-unit change	395
			Multiple-unit change	395
			Milestone change in units	396
			One SD change in predictor	397
			Partial and semipartial correlation	398
	14.4	Testing	multiple coefficients	400
		14.4.1	Testing whether coefficients equal zero	400
		14.4.2	Testing the equality of coefficients	401
		14.4.3	Testing linear combinations of coefficients	402

xvi

	14.5	Closing thoughts					
15	More	e details about the regress command 405					
	15.1	Chapter overview					
	15.2	Regression options					
	15.3	Redisplaying results					
	15.4	Identifying the estimation sample 411					
	15.5	Stored results					
	15.6	Storing results					
	15.7	Displaying results with the estimates table command 417					
	15.8	Closing thoughts					
16	Pres	enting regression results 419					
	16.1	Chapter overview					
	16.2	Presenting a single model					
	16.3	Presenting multiple models					
	16.4	Creating regression tables using esttab					
		16.4.1 Presenting a single model with esttab 428					
		16.4.2 Presenting multiple models with esttab 435					
		16.4.3 Exporting results to other file formats 436					
	16.5	More commands for presenting regression results 438					
		16.5.1 outreg					
		16.5.2 outreg2					
		16.5.3 xml_tab					
		16.5.4 coefplot					
	16.6	Closing thoughts					
17	Tool	s for model building 443					
	17.1	Chapter overview					
	17.2	Fitting multiple models on the same sample					
	17.3	Nested models					
		17.3.1 Example 1: A simple example					
		17.3.2 Example 2: A more realistic example 451					

Con	tents		xvii
	17.4	Stepwise models	454
	17.5	Closing thoughts	456
18	Regr	ession diagnostics	457
	18.1	Chapter overview	457
	18.2	Outliers	458
		18.2.1 Standardized residuals	460
		18.2.2 Studentized residuals, leverage, Cook's D	463
		18.2.3 Graphs of residuals, leverage, and Cook's D	466
		18.2.4 DFBETAs and avplots	467
		18.2.5 Running a regression with and without observations	471
	18.3	Nonlinearity	472
		18.3.1 Checking for nonlinearity graphically	472
		18.3.2 Using scatterplots to check for nonlinearity	473
		18.3.3 Checking for nonlinearity using residuals	474
		18.3.4 Checking for nonlinearity using a locally weighted smoother	475
		18.3.5 Graphing an outcome mean at each level of predictor	476
		18.3.6 Summary	479
		18.3.7 Checking for nonlinearity analytically	479
		Adding power terms	480
		Using factor variables	481
	18.4	Multicollinearity	485
	18.5	Homoskedasticity	487
	18.6	Normality of residuals	489
	18.7	Closing thoughts	491
19	Powe	r analysis for regression	493
	19.1	Chapter overview	493
	19.2	Power for simple regression	493
	19.3	Power for multiple regression	500
	19.4	Power for a nested multiple regression	500
	19.5	Closing thoughts	504

xviii Contents

\mathbf{V}	Stat	a overview 5	507
20	Com	mon features of estimation commands	509
	20.1	Chapter overview	509
	20.2	Common syntax	510
	20.3	Analysis using subsamples	511
	20.4	Robust standard errors	512
	20.5	Prefix commands	513
		20.5.1 The by: prefix	513
		20.5.2 The nestreg: prefix	514
		20.5.3 The stepwise: prefix	515
		20.5.4 The svy: prefix	515
		20.5.5 The mi estimate: prefix	516
	20.6	Setting confidence levels	516
	20.7	Postestimation commands	517
	20.8	Closing thoughts	517
2 1	Post	estimation commands	519
	21.1	Chapter overview	519
	21.2	The contrast command	519
	21.3	The margins command	524
		21.3.1 The at() option	525
		21.3.2 Margins with factor variables	529
		21.3.3 Margins with factor variables and the at() option	533
		21.3.4 The dydx() option	534
	21.4	The marginsplot command	539
	21.5	The pwcompare command	550
	21.6	Closing thoughts	555
22	Stata	a data management commands	557
	22.1	Chapter overview	557
	22.2	Reading data into Stata	558
		22.2.1 Reading Stata datasets	558

Contents					xix
	22.2.2	Reading Excel workbooks	 	 	559

		22.2.2	Reading Excel workbooks	559
		22.2.3	Reading comma-separated files	560
		22.2.4	Reading other file formats	560
	22.3	Saving of	data	561
	22.4	Labeling	g data	562
		22.4.1	Variable labels	563
		22.4.2	A looping trick	563
		22.4.3	Value labels	565
	22.5	Creating	g and recoding variables	566
		22.5.1	Creating new variables with generate	566
		22.5.2	Modifying existing variables with replace	567
		22.5.3	Extensions to generate egen	568
		22.5.4	Recode	569
	22.6	Keeping	g and dropping variables	570
	22.7	Keeping	g and dropping observations	572
	22.8	Combin	ing datasets	574
		22.8.1	Appending datasets	574
		22.8.2	Merging datasets	576
	22.9	Reshapi	ing datasets	578
		22.9.1	Reshaping datasets wide to long	578
		22.9.2	Reshaping datasets long to wide	580
	22.10	Closing	thoughts	582
23	Stata	equiva	lents of common IBM SPSS Commands	583
	23.1	Chapter	r overview	584
	23.2	ADD F	ILES	584
	23.3	AGGRE	EGATE	586
	23.4	ANOVA	.	588
	23.5	AUTOF	RECODE	589
	23.6	CASES'	TOVARS	591
	23.7	COMPU	UTE	593

xx Contents

23.8	CORRELATIONS	594
23.9	CROSSTABS	594
23.10	DATA LIST	596
23.11	DELETE VARIABLES	597
23.12	DESCRIPTIVES	599
23.13	DISPLAY	600
23.14	DOCUMENT	601
23.15	FACTOR	602
23.16	FILTER	602
23.17	FORMATS	603
23.18	FREQUENCIES	603
23.19	GET FILE	605
23.20	GET TRANSLATE	605
23.21	LOGISTIC REGRESSION	606
23.22	MATCH FILES	606
23.23	MEANS	608
23.24	MISSING VALUES	608
23.25	MIXED	610
23.26	MULTIPLE IMPUTATION	611
23.27	NOMREG	611
23.28	PLUM	612
23.29	PROBIT	613
23.30	RECODE	614
23.31	RELIABILITY	615
23.32	RENAME VARIABLES	615
23.33	SAVE	617
23.34	SELECT IF	618
23.35	SAVE TRANSLATE	618
23.36	SORT CASES	618
23.37	SORT VARIABLES	619

Contents	xxi
23.38 SUMMARIZE	519
23.39 T-TEST	519
23.40 VALUE LABELS	520
23.41 VARIABLE LABELS	521
23.42 VARSTOCASES	523
23.43 Closing thoughts	524
References 6	25
Author index 6	27
Subject index 6	29



Preface

I worked as a statistical consultant at the University of California, Los Angeles, ATS statistical consulting group for over 12 years. Before the start of every walk-in consulting session, I would wonder about the questions that would walk into our office. Every session was different, with people bringing questions from all parts of the campus. When a new client walked in the door, one of my first questions was, What department are you from? It might have seemed like a polite question as we got to know each other before diving into the heart of his or her problem. But this was an essential question for me: the answer would guide the way I handled the entire visit.

In working as a consultant who served so many schools and departments, I discovered that there are many regional dialects of statistics. Depending on your school or department, there are certain types of statistical models you emphasize, customs you embrace, and types of terminology you favor. This is why there are statistics books that are written specifically for certain disciplines—to address the statistical customs and traditions within that discipline.

My home discipline is psychology, in which I received my bachelor's, master's, and doctorate. As I was taught statistics, my professors focused on forming specific hypothesis tests for the exact predicted pattern of results. They emphasized taking a laserlike focus on specific contrasts that would directly test the hypothesis of interest. This was especially the case when I was taught about factorial analysis of variance (ANOVA), where a finding of an overall interaction effect was nothing to get excited about because the significant interaction could be consistent with a variety of patterns of results, some of which could be contrary to our hypotheses. We were taught to graph the interactions and probe and dissect the interaction using planned contrasts to test for the exact pattern of results that we hypothesized.

xxxii Preface

I brought this training to my statistical consulting and my use of statistical packages. However, I frequently found that my training regarding ways of dissecting interactions was not so easily supported by statistical packages—that is, until the most recent versions of Stata. Unlike any other statistical package that I have ever used, Stata provides a suite of tools that allows us to probe, interpret, understand, and graph the results of ANOVA models. These tools are incredibly powerful; they are also very simple and intuitive. In this book, I show how you can use this suite of ANOVA tools to easily form contrasts among groups and dissect interactions with surgical precision. This allows you to present tests of hypotheses regarding the specific pattern of your results, establishing not only that your results are significant but also that they are in the pattern predicted. The suite of tools also integrates graphing tools so that you can use graphics as a means of interpreting your results and for presenting results to others.

The heart and spirit of this book is about showcasing this suite of ANOVA tools that Stata offers, but that does not mean this book is limited to just the presentation of ANOVA. This is because this suite of ANOVA tools can be applied to a wide variety of designs, including analysis of covariance, analysis of covariance with interactions, repeated measures designs, longitudinal designs, and the analysis of survey data to name just a few. This suite of tools can also be used in the context of a wide variety of regression modeling methods, including ordinary regression, robust regression, multilevel models, logistic regression, and Poisson regression.

As I see it, one of the strengths of learning statistics from a behavioral science perspective is seeing how factorial designs can help us understand how the effect of one variable is moderated by another variable through testing of interactions. With most statistical packages, you are handcuffed to using these tools only in the context of a traditional ANOVA. Once you extend your reach outside that realm, these tools are taken away from you. In Stata, you carry this suite of tools with you as you run a multilevel model, a robust regression, a logistic regression, or even a regression based on complex survey sampling. In this book, my aim is to show how you can use these familiar tools and to enable you to apply them across a wide variety of designs and modeling methods.

While this book draws upon my statistical training from the perspective of psychology, it is written for anyone in the behavioral sciences and anyone who would like to learn how to apply ANOVA (and ANOVA-like tools) to a variety of designs and modeling techniques using Stata. Regardless of your home discipline, I hope this book shows how you can use Stata to understand your results so that you can interpret and present them with clarity and confidence.

Valencia, California July 2015 Michael N. Mitchell



5 Contrasts for a one-way ANOVA

5.1	Chap	ter overview	85
5.2	Intro	ducing contrasts	86
	5.2.1	Computing and graphing means	88
	5.2.2	Making contrasts among means	89
	5.2.3	Graphing contrasts	90
	5.2.4	Options with the margins and contrast commands	92
	5.2.5	Computing effect sizes for contrasts	96
	5.2.6	Summary	98
5.3	Overv	view of contrast operators	98
5.4	Comp	pare each group against a reference group	99
	5.4.1	Selecting a specific contrast	100
	5.4.2	Selecting a different reference group	101
	5.4.3	Selecting a contrast and reference group	101
5.5	Comp	pare each group against the grand mean	102
	5.5.1	Selecting a specific contrast	104
5.6	Comp	pare adjacent means	105
	5.6.1	Reverse adjacent contrasts	108
	5.6.2	Selecting a specific contrast	109
5.7	Comp	paring with the mean of subsequent and previous levels .	111
	5.7.1	Comparing with the mean of previous levels	115
	5.7.2	Selecting a specific contrast	116
5.8	Polyn	omial contrasts	117
5.9	Custo	om contrasts	120
5.10	Weigh	nted contrasts	123
5.11	Pairw	rise comparisons	125
5.12	Closin	ng thoughts	133

5.1 Chapter overview

This chapter is devoted to showing you how to perform specific comparisons among groups (contrasts) after performing a one-way analysis of variance (ANOVA). Such contrasts allow you to test for the exact pattern of results that you hypothesized before

the start of your study. This chapter illustrates many different kinds of contrasts that you can perform using Stata's built-in contrast operators. Further, it shows how you can perform custom contrasts (if you want to perform a contrast that is not among the built-in contrasts).

5.2 Introducing contrasts

It turns out that Professor Cheer is interested in studying happiness as well as studying optimism. She is interested in exploring the effect of marital status on happiness. She decides to explore this question using the General Social Survey (GSS) dataset from the year 2012. The use command reads this dataset into memory. (Section 1.1 shows how to download the example datasets.)

. use gss2012_sbs, clear

Let's start by looking at a frequency distribution of the variable marital, which contains the marital status of the respondent. The distribution of this variable is shown with the user-written fre command (see section 1.1 to see how to download this command).

. fre marital marital — marital status

		Freq.	Percent	Valid	Cum.
Valid	1 married	900	45.59	45.59	45.59
	2 widowed	163	8.26	8.26	53.85
	3 divorced	317	16.06	16.06	69.91
	4 separated	68	3.44	3.44	73.35
	5 never married	526	26.65	26.65	100.00
	Total	1974	100.00	100.00	

This shows that 1,974 people responded, and their responses were coded as married, widowed, divorced, separated, or never married. The fre command shows the numeric codes associated with each of these responses.

Let's now use the fre command to show the frequency distribution for the variable happy7, which is the happiness rating of the respondent on a 1 to 7 scale. We can see that a response of 1 represents Completely unhappy and that a response of 7 represents Completely happy. For this question, there are 1,284 valid responses and 690 missing values. This large number of missing values reflects the fact that this question was only asked of some of the respondents.

			Freq.	Percent	Valid	Cum.
Valid	1	Completely unhappy	5	0.25	0.39	0.39
	2	Very unhappy	16	0.81	1.25	1.64
	3	Fairly unhappy	35	1.77	2.73	4.36
	4	Neither happy nor unhappy	77	3.90	6.00	10.36
	5	Fairly happy	440	22.29	34.27	44.63
	6	Very happy	563	28.52	43.85	88.47
	7	Completely happy	148	7.50	11.53	100.00
	Total		1284	65.05	100.00	
Missing		Cannot choose	11	0.56		
	.i	Inapplicable	672	34.04		
	.n	No Answer	7	0.35		
	To	tal	690	34.95		
Total			1974	100.00		

Let's now perform a one-way ANOVA in which happy7 is the DV¹ and marital status (marital) is the IV.

. anova happy7 marital

_	Number of obs = Root MSE =	1,284 .977102			0.0408 0.0378
Source	Partial SS	df	MS	F	Prob>F
Model	51.89968	4	12.97492	13.59	0.0000
marital	51.89968	4	12.97492	13.59	0.0000
Residual	1221.0972	1,279	.95472807		
Total	1272.9969	1,283	.99220334		

The F statistic above tests the null hypothesis that the mean of happiness is equal for all five levels of marital status. We can express this null hypothesis as shown below.

$$H_0$$
: $\mu_1 = \mu_2 = \mu_3 = \mu_4 = \mu_5$

The overall test of this null hypothesis is significant: F(4, 1279) = 13.59, p < 0.001. We can reject the null hypothesis that the average happiness is equal among the five marital status groups.

Some might be bothered by analyzing a Likert scale like happy7 as though it were measured on an
interval scale. For the sake of these examples, let's assume that happy7 is measured on an interval
scale.

5.2.1 Computing and graphing means

Let's use the margins command to compute the mean of happiness by marital status. This output shows, for example, that the mean of happiness for those who are married (group 1) is 5.71 with a 95% confidence interval (CI) of 5.63 to 5.79.

. margins marita	al, nopvalues				
Adjusted predict	cions	Number	of obs	=	1,284
Expression : I	Linear prediction, predict()				
	Delta-method				
	Margin Std. Err.	[95% Conf.	Interval]		

	Margin	Std. Err.	[95% Conf. Interval]
marital			
married	5.714038	.0406773	5.634237 5.79384
widowed	5.429907	.09446	5.244593 5.61522
divorced	5.252475	.0687486	5.117603 5.387348
separated	5.119048	.1507701	4.823264 5.414831
never married	5.365169	.0517863	5.263573 5.466764

The marginsplot command can be used to make a graph of the means and CIs reported by the margins command. This produces the graph shown in figure 5.1.

. marginsplot

Variables that uniquely identify margins: marital

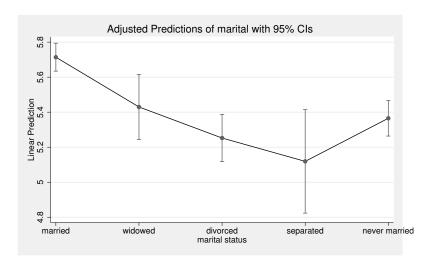


Figure 5.1: Mean happiness by marital status

5.2.2 Making contrasts among means

Let's probe this finding in more detail. Suppose that Professor Cheer predicted (before even seeing the data) that those who are married will be happier than each of the four other marital status groups. We can frame this as four separate null hypotheses, shown below.

$$H_0\#1: \mu_2 = \mu_1$$

 $H_0\#2: \mu_3 = \mu_1$
 $H_0\#3: \mu_4 = \mu_1$
 $H_0\#4: \mu_5 = \mu_1$

The first null hypothesis states that the mean happiness is the same for group 2 and group 1 (widowed versus married). The second states that the mean happiness is the same for groups 3 and 1 (divorced versus married). The third states that the mean happiness is the same for groups 4 and 1 (separated versus married). Finally, the fourth states that the mean happiness is the same for groups 5 and 1 (never married versus married).

We can test each of these four null hypotheses using the contrast command shown below. (I will discuss the syntax of the contrast command shortly.)

```
. contrast r.marital
Contrasts of marginal linear predictions
Margins : asbalanced
```

	df	F	P>F
marital			
(widowed vs married)	1	7.63	0.0058
(divorced vs married)	1	33.39	0.0000
(separated vs married)	1	14.52	0.0001
(never married vs married)	1	28.07	0.0000
Joint	4	13.59	0.0000
Denominator	1279		

	Contrast	Std. Err.	[95% Conf.	Interval]
marital (widowed vs married) (divorced vs married) (separated vs married) (never married vs married)	2841316	.1028462	4858973	0823659
	4615629	.0798813	6182756	3048502
	5949905	.156161	9013504	2886306
	3488696	.0658518	478059	2196801

This contrast command compares each marital status group to group 1. The first test compares those who are widowed with those who are married. The upper portion of

the output shows the F statistic for the test of this hypothesis. This test is statistically significant: F(1,1279) = 7.63, p = 0.0058. The lower portion of the output shows that the average difference in the happiness for those who are widowed versus married is -0.28, (95% CI = [-0.49, -0.08]). Those who are widowed are significantly less happy than those who are married. Put another way, those who are married are significantly happier than those who are widowed. We can reject $H_0\#1$ and say the results are consistent with our prediction that those who are married are significantly happier.

Let's now consider the output for the second, third, and fourth contrasts. These test the second, third, and fourth null hypotheses contrasting those who are divorced versus married, separated versus married, and never married versus married. The upper portion of the contrast output shows that each of these contrasts is statistically significant ($ps \leq 0.001$). Further, the differences in the means (as shown in the lower portion of the output) are always negative, indicating that those who are married are happier than the group they are compared with. Thus we can reject the second, third, and fourth null hypotheses.

To summarize, we can reject all four null hypotheses. Further, each difference was in the predicted direction. Those who are married are significantly happier than those who are widowed, significantly happier than those who are divorced, significantly happier than those who are separated, and significantly happier than those who have never been married.

5.2.3 Graphing contrasts

Let's create a graph that visually depicts these contrasts. We first use the margins command to replicate the results we found above via the contrast command. (This will allow us to then use the marginsplot command to graph the results from the margins command.)



23 Stata equivalents of common IBM SPSS Commands

23.1	Chapter overview	584
23.2	ADD FILES	584
23.3	AGGREGATE	586
23.4	ANOVA	588
23.5	AUTORECODE	589
23.6	CASESTOVARS	591
23.7	COMPUTE	593
23.8	CORRELATIONS	594
23.9	CROSSTABS	594
23.10	DATA LIST	596
23.11	DELETE VARIABLES	597
23.12	DESCRIPTIVES	599
23.13	DISPLAY	600
23.14	DOCUMENT	601
23.15	FACTOR	602
23.16	FILTER	602
23.17	FORMATS	603
23.18	FREQUENCIES	603
23.19	GET FILE	605
23.20	GET TRANSLATE	605
23.21	LOGISTIC REGRESSION	606
23.22	MATCH FILES	606
23.23	MEANS	608
23.24	MISSING VALUES	608
23.25	MIXED	610
23.26	MULTIPLE IMPUTATION	611
23.27	NOMREG	611
	PLUM	612
23.29	PROBIT	613
	RECODE	614

23.31	RELIABILITY	615
23.32	RENAME VARIABLES	615
23.33	SAVE	617
23.34	SELECT IF	618
23.35	SAVE TRANSLATE	618
23.36	SORT CASES	618
23.37	SORT VARIABLES	619
23.38	SUMMARIZE	619
23.39	T-TEST	619
23.40	VALUE LABELS	620
23.41	VARIABLE LABELS	621
23.42	VARSTOCASES	623
23.43	Closing thoughts	624

23.1 Chapter overview

When taking a language class, you often would have a book that would quickly translate English words into another language (say, Spanish). In some cases, there would be one exact word that was the equivalent of the English word, and in other cases, the translation would be a bit more murky. There might be two or more equivalent words, or the words would have similar but not exact meanings. Well, think of this chapter as an IBM® SPSS® to Stata translation, where sometimes, the SPSS command has an exact equivalent, and sometimes, there is a little bit more in the translation.

This chapter lists commonly used SPSS commands (in alphabetical order) and shows the equivalent (or near equivalent) Stata command along with one or more examples of the Stata command. The aim of this chapter is to help you learn, for example, that the Stata equivalent of the SPSS AGGREGATE command is the collapse command and to show a simple example of the collapse command. To that end, the examples are intentionally simple (and sometimes might be overly simplistic). But once you know that the command you want is, for example, the collapse command, you can then type help collapse and access the Stata documentation for all the details about the use of the collapse command.

23.2 ADD FILES

Stata equivalent: append

Example: Consider the file moms.dta, which contains a family ID variable, the mother's age, race, and whether she graduated from high school.