## How to Cheat with Statistics — and Get Away with It

From Data Snooping over Kitchen Sink Regression to "Creative Reporting"

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## Contents

Preface							
Ab	out tl	he Auth	nor	vii			
1.	Input Manipulation						
	1.1	Manipulating Input Data					
		1.1.1	Data Snooping	1			
		1.1.2	Biased Sampling	3			
		1.1.3	Eliminating Outliers	5			
		1.1.4	Just Use False Inputs: The Hwang Woo-suk				
			Cloning Scandal	8			
		1.1.5	Data Transformation: Is Standardization or				
			Transformation to Percentages Statistical				
			Cheating?	9			
	1.2	Manipulating the Research Timeframe					
		1.2.1	Timeframe Snooping	16			
		1.2.2	Lengthening and Shortening the Time Frame	17			
	Conclusion: How to Catch Input Manipulators Piece						
	of Cake						
	Questions and Problems						
	Appendix A.1: The Complete List Why Mathematicians						
		Look	Down on Statisticians	22			

Appendix A.2: Data Transformation in the Copula Model 23

Appendix A.3: The Nitty-Gritty When Calculating Standard Deviation and Volatility 26   References 30   2. Manipulating Statistical Calculations 31   2.1 Regression Analysis 31   2.1.1 Applying the Linear Pearson Model to Nonlinear Data 39   2.1.2 Polynomial Regression: Under- and Overfitting 39   2.1.3 Correlation Does Not Imply Causation! 44   2.1.4 Kitchen Sink Regression 54   2.1.5 Multicollinearity Can Distort Individual Regressors 60   2.1.6 Heteroskedasticity to Manipulate Standard Errors 66   Summary and Conclusion: How to Catch Regression Cheaters Pretty Easy 70   2.2 Inferential Statistics 72
2. Manipulating Statistical Calculations 31   2.1 Regression Analysis 31   2.1.1 Applying the Linear Pearson Model to Nonlinear Data 39   2.1.2 Polynomial Regression: Under- and Overfitting 39   2.1.3 Correlation Does Not Imply Causation! 44   2.1.4 Kitchen Sink Regression 54   2.1.5 Multicollinearity Can Distort Individual Regressors 60   2.1.6 Heteroskedasticity to Manipulate Standard Errors 66   Summary and Conclusion: How to Catch Regression 70   2.2 Inferential Statistics 72
2. Manipulating Statistical Calculations 31   2.1 Regression Analysis 31   2.1.1 Applying the Linear Pearson Model to Nonlinear Data 39   2.1.2 Polynomial Regression: Under- and Overfitting 39   2.1.3 Correlation Does Not Imply Causation! 44   2.1.4 Kitchen Sink Regression 54   2.1.5 Multicollinearity Can Distort Individual Regressors 60   2.1.6 Heteroskedasticity to Manipulate Standard Errors 60   Summary and Conclusion: How to Catch Regression 70   2.2 Inferential Statistics 72
2.1 Regression Analysis 31   2.1.1 Applying the Linear Pearson Model to 39   2.1.2 Polynomial Regression: Under- and 39   2.1.2 Polynomial Regression: Under- and 44   2.1.3 Correlation Does Not Imply Causation! 48   2.1.4 Kitchen Sink Regression 54   2.1.5 Multicollinearity Can Distort Individual 54   2.1.6 Heteroskedasticity to Manipulate Standard 60   2.1.6 Heteroskedasticity to Catch Regression 66   Summary and Conclusion: How to Catch Regression 70   2.2 Inferential Statistics 72
2.1.1 Applying the Linear Pearson Model to Nonlinear Data 39   2.1.2 Polynomial Regression: Under- and Overfitting 44   2.1.3 Correlation Does Not Imply Causation! 48   2.1.4 Kitchen Sink Regression 54   2.1.5 Multicollinearity Can Distort Individual Regressors 60   2.1.6 Heteroskedasticity to Manipulate Standard Errors 66   Summary and Conclusion: How to Catch Regression Cheaters Pretty Easy 70   2.2 Inferential Statistics 72
2.1.2 Polynomial Regression: Under- and Overfitting
Overfitting
2.1.3 Correlation Does Not Imply Causation! 48   2.1.4 Kitchen Sink Regression 54   2.1.5 Multicollinearity Can Distort Individual Regressors 54   2.1.6 Heteroskedasticity to Manipulate Standard Errors 60   Summary and Conclusion: How to Catch Regression Cheaters 66   Summary and Conclusion: How to Catch Regression Cheaters 70   2.2 Inforential Statistics 72
2.1.4 Kitchen Sink Regression 54   2.1.5 Multicollinearity Can Distort Individual Regressors 60   2.1.6 Heteroskedasticity to Manipulate Standard Errors 66   Summary and Conclusion: How to Catch Regression Cheaters Pretty Easy 70   2.2 Inferential Statistics 72
2.1.5 Multicollinearity Can Distort Individual Regressors 60   2.1.6 Heteroskedasticity to Manipulate Standard Errors 60   Summary and Conclusion: How to Catch Regression Cheaters 66   Summary and Conclusion: How to Catch Regression Cheaters 70   2.2 Inforential Statistics 72
Regressors 60   2.1.6 Heteroskedasticity to Manipulate Standard   Errors 66   Summary and Conclusion: How to Catch Regression 66   Cheaters 70   2.2 Inferential Statistics 72
2.1.6 Heteroskedasticity to Manipulate Standard   Errors 66   Summary and Conclusion: How to Catch Regression   Cheaters 70   2.2 Inferential Statistics 72
Summary and Conclusion: How to Catch Regression 70   Cheaters Pretty Easy 72   Informatial Statistics 72
Cheaters Pretty Easy702.2Inferential Statistics72
2.2 Inferential Statistics 72
2.2.1 Increasing the Sample Size $n$ to Increase
Significance
2.2.2 Manipulating the Population Mean $\mu$ 78
2.2.3 Manipulating the Population Standard
Deviation Parameter, the "Nuisance
Parameter" $\sigma$
2.2.4 Changing a Two-tailed Test into a One-tailed
Lest
Choose Piece Col 2
Questions and Broblems
Appendix A 1. Nexts Moth C 1. Lat. C. al. C. L. L
Deviation Covariance and the Converti
Coefficient
Appendix A.2: On the Slope of the Regression function 87

	Contents   Appendix A.3: Derivation of SST = SSE + SSR   Appendix A.4: Derivation of the z-Score   References				
3.	"Cr	eative	Reporting", i.e., Distorting Outputs	93	
	3.1 Numerical Bias				
		3.1.1	Profits from Nothing: Adding Percentage		
			Changes	93	
		3.1.2	Reporting Bias in Academia	96	
		3.1.3	Reporting Bias in Practice	102	
	3.2	Visua	l Bias	108	
		3.2.1	Image Distortion	108	
		3.2.2	Truncating the Y-Axis	110	
		3.2.3	Different Axes Units	112	
		3.2.4	Logarithmic Display	114	
		3.2.5	Omitting Data	116	
		3.2.6	2D Versus 3D Data Representation	118	
	Summary: How to Identify Creative Reporters No Problem				
	Que	stions a	and Problems	122	