

## Generalized Linear Models (ST425A) (Advanced level course, 7.5 hec, Aut. 2019) Re-Examnation (Part 2)

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- Date and time: Monday 4 November 2019, 14:00 16:00
- Permitted facilities: Pocket calculator and attached R- and SAS-codes.
- Return of exam: Not yet decided (information will be sent via e-mail or Athena).
- Instructions:
  - The total amount of points for this part of the exam is 20.
  - The minimum requirement to pass this part of examination is 10 points.
  - Solutions to each question should be detailed enough and wellmotivated in order to get full points.

The table below presents values of response variable (y) and two explanatory variables  $(x_1 \text{ and } x_2)$  on 20 observations. The table is also available in text and excel formats.

i	1	2	3	4	5	6	7	8	9	10	11	12	13	14	15	16	17	18	19	20
$y_i$	1	10	29	25	29	40	21	0	13	4	0	7	21	9	7	22	6	2	29	11
$x_{1i}$	46	74	89	77	84	89	68	70	60	55	35	51	87	83	68	84	74	73	84	91
																	3			7

- a) Begin by plotting all possible pairs of variables to get an idea on associations between them. Describe your results (plots)
- b) Fit appropriate model to assess the relationship of Y and  $X_1$  and interpret the resulting parameter estimates. What assumption did you make to fit your chosen model?
- c) Extend your model in (b) by adding  $X_2$  and interpret your output (estimated parameters and associated measures of fit)
- d) Compute the Gross and Net Effects of the explanatory variables  $(X_1$  and  $X_2)$  on the response variable
- e) Use some form of diagnostics on your model in (c) and examine if any observation(s) looks to be an outlier

Summarize your results in a form of a report that includes choice of a model (with justification), the fitted model, and overall comments on your results (estimates and test statistics). Attach relevant SAS or R codes, tables and figures as appendices.

## Generalized Linear Models 2019: R- and SAS Commands

Packages Used	
car	
ResourceSelection	
aod	
nnet	
MASS	
VGAM	
vcd	
mcprofile	
Imtest	

Description	Command
Simple/multiple linear regression	Im(formula, data)
One-way / Two-way ANOVA	aov(formula , data)
Type I SS	anova(model)
Type II or III SS	Anova(model , type="II") Anova(model , type="III")
Binary regression	glm(cbind(y,n-y)~, family=binomial(link="logit"),data)
	link=c("logit ","probit ","cloglog")
Odds ratio estimates (model with interaction)	predict.glm(model, newdata=data.frame(x1=c(),x2=factor()),se.fit=TRUE)
Multinomial logistic regression	multinom(formula,data,weights)
Proportional odds models	polr(formula,data,weights,Hess=TRUE,method="logistic") method = c("logistic", "probit", "cloglog", "cauchit")
	vglm(formula=formula, family=cumulative (link="logitlink",parallel=T, reverse=F), weights,data)
Adjacent-Category model (with proportional odds assumption)	vglm( formula, family=acat (link="loglink", parallel=T, reverse=F), weights,data)

Continuation ratio (with proportional odds assumption)	vglm(formula,family=sratio(link="loglink",parallel=T,reverse=F), weights,data)
Log-linear models	glm(formula, family=poisson(link="log"), data)
Rate ratio + CI	exp(confint(mcprofile(model , CM=matrix(C,1))) where C is the contrast matrix
Standardized residuals	rstandard(model)
Jack-knife/studentized residuals	rstudent(model)
Cooks distance	cooks.distance(model)
Leverages	hatvalues(model)
Pearson residuals	residuals(model,type="pearson")
Deviance residuals	residuals(model,type="deviance")
Akaike's information criterion	AIC(model)
Bayesian information criterion	BIC(model)
Log likelihood	logLik(model)
deviance	deviance(model)
Likelihood ratio test	anova(model1,model2, test="Chisq")
Shapiro-Wilk Test	shapiro.test()
Breush Pagan Test	bptest(model)
Tests for homogeneity of variance across groups	fligner.test(y~group, data) leveneTest(y~group, data)
Hosmer-Lemeshow's goodness of fit	hoslem.test(y, fitted(model), g=)
Wald test	wald.test(b = coef(model), Sigma = vcov(model), Terms =)
Testing for single/joint effects of covariates/factors	linearHypothesis(M1,c("coef1"," coef2"),test="Chisq") linearHypothesis(M1,c("coef1=0"),test="Chisq") linearHypothesis(M1,c("coef1"=" coef2"),test="Chisq")
Pearson chi-Squared test for independence	assocstats(H)
Confidence Intervals for parameter estimates	confint() confint.default()

Relevel/order factors	relevel(x, ref="") factor(x,levels=unique(x)) factor(x,ordered=T)	

Description	Command
Description	Command
Simple/multiple linear regression	proc glm data = data plots=diagnostics; model formula/ SS1 SS2 SS3 solution; means x; Ismeans x / adjust = tukey cl; output out = estim p= phat r=resid student = stresid cookd=cooks dffits = DFIT h = hat_matrix;
anova	class A (ref = 'A1') B (ref = 'B1');
Binary regression	proc logistic data = dataset; model formula /link=LOGIT (orPROBIT or CLOGLOG) aggregate scale = none influence; effectplot fit/obs; output out=tablename pred=logit (or probit or pcloglog) resdev = resdev reschi= Pearson stdresdev = stdresdev stdreschi = stdPearson; run;
Odds ratio estimates (model with interaction)	EFFECTPLOT FIT (PLOTBY = name of CLASS variable)/obs; ODDSRATIO name of class var;
Multinomial logistic regression	ods graphics on; proc logistic data=data; freq frequency; class var1 (ref=" param=ref) var2(ref=" param=ref); model response (ref='baseline')=var1var2/ link = glogit; effectplot interaction (plotby=var1)/polybar; oddsratio var; run;
cumulative logit model	model / LINK = clogit scale=none aggregate; effectplot interaction(plotby=covariate); output out=pred predprobs= i predprobs = c;
Adjacent-Category model (with proportional odds assumption)	
Continuation ratio (with proportional odds assumption)	
Contingency table  Log-linear models	proc freq data = dataset order = data; weight n; tables var1*var2 / chisq expected nopercent nocol nocum norow; run; proc genmod data = data;

	class var1 (ref = 'reference group name') var2 (ref = ' reference group name"); model formula / dist = poisson obstats type3; ods output obstats = test1 (keep = frequency type site pred
v. II	Xbeta std Reschi Resdev); run;
Rate ratio + CI	estimate 'RR' var1 1 0 -1 0 var1*var2 1 00 /e ;
Standardized residuals	
Jack-knife/studentized residuals	
Cooks distance	
Leverages	
Pearson residuals	
Deviance residuals	
Akaike's information criterion	
Bayesian information criterion	
Log likelihood	
deviance	
Likelihood ratio test	
Shapiro-Wilk Test	
Breush Pagan Test	
Tests for homogeneity of variance across groups	
Hosmer-Lemeshow's goodness of fit	proc logistic data = data; model formula/ link=logit lackfit; run;
Wald test	i
Testing for single/joint	
effects of covariates/factors	
Pearson chi-Squared test for independence	
Confidence Intervals for parameter estimates Relevel/order factors	