

Appendix

Joe Backer, Elle Dodd, Dan Humphrey, Dan Peckham

3/25/2017

```
library(haven)
library(sandwich)
library(stargazer)
library(ggplot2)
library(car)
library(knitr)
library(plyr)
library(lfe)
library(plm)
library(gtools)

afghan <- read_dta("~/Documents/Stats2/pivotproject/afghandata.dta")
afghan <- rename(afghan, c("f07_hh_id" = "hh_id",
  "f07_heads_child_cnt" = "heads_child",
  "f07_girl_cnt" = "girl",
  "f07_age_head_cnt" = "age_head",
  "f07_yrs_ed_head_cnt" = "yrs_ed_head",
  "f07_jeribs_cnt" = "jeribs",
  "f07_num_sheep_cnt" = "num_sheep",
  "f07_duration_village_cnt" = "duration_village",
  "f07_farsi_cnt" = "farsi",
  "f07_tajik_cnt" = "tajik",
  "f07_farmer_cnt" = "farmer",
  "f07_num_ppl_hh_cnt" = "num_ppl_hh",
  "f07_test_observed" = "test_observed",
  "f07_formal_school" = "formal_school",
  "f07_nearest_scl" = "nearest_scl",

  # non-matching new names#
  "f07_age_cnt" = "age_child",
  "f07_both_norma_total" = "test_score_normalized"
))
afghan$sheep_per_hh_member = afghan$num_sheep / afghan$num_ppl_hh
attach(afghan)

# create data frame of only the variables of interest
remove <- c("hh_id", "observation_id")
varlist <- colnames(afghan[, !names(afghan) %in% remove])
balance_variables <- afghan[, !colnames(afghan) %in% remove]

# generate counts
n_treatment <- apply(balance_variables[balance_variables$treatment == 1, ],
  2, function(x) length(which(!is.na(x))))
n_control <- apply(balance_variables[balance_variables$treatment == 0, ], 2,
  function(x) length(which(!is.na(x))))

# generate table
```

```

balancetable <- cbind(n_control, n_treatment)
# drop treatment row
balancetable <- balancetable[!rownames(balancetable) == "treatment", ]

# run t.tests, skipping treatment[14]
balance_tests <- lapply(varlist[c(1:13, 15:20)], function(x) {
  t.test(as.formula(paste(x, "treatment", sep = "~")), data = balance_variables,
    alternative = "two.sided", mu = 0, paired = FALSE, var.equal = FALSE,
    conf.level = 0.95)
})

# extract and adjust p vals
balance_test_pvals <- t(sapply(balance_tests, function(x) {
  c(x$estimate[], `diff in means` = unname(x$estimate[1]) - unname(x$estimate[2]),
    ci.lower = x$conf.int[1], ci.upper = x$conf.int[2], p.value = x$p.value,
    adj.p.value = p.adjust(x$p.value, method = "bonferroni", n = length(x)),
    x$parameter)
}))

balance_test_pvals <- data.frame(balance_test_pvals, stringsAsFactors = FALSE)
balance_test_pvals[] <- lapply(balance_test_pvals, function(x) as.numeric(as.character(x)))
balancetable <- cbind(balancetable, balance_test_pvals)
balancetable <- round(balancetable, 3)
kable(balancetable)

```

	n_control	n_treatment	mean.in.group.0	mean.in.group.1	diff.in.means	ci.lower	ci.upper
heads_child	730	830	0.911	0.927	-0.016	-0.043	0.011
girl	730	830	0.456	0.478	-0.022	-0.072	0.028
age_child	730	830	8.321	8.322	-0.001	-0.165	0.163
age_head	730	830	40.219	40.090	0.129	-0.991	1.249
yrs_ed_head	730	830	3.101	3.531	-0.431	-0.788	-0.074
jeribs	730	830	1.510	1.498	0.011	-0.211	0.232
num_sheep	730	830	6.404	9.586	-3.181	-4.351	-2.011
duration_village	730	830	27.662	30.172	-2.509	-4.059	-0.959
farsi	730	830	0.205	0.210	-0.004	-0.045	0.036
tajik	730	830	0.204	0.239	-0.034	-0.076	0.008
farmer	730	830	0.729	0.707	0.022	-0.023	0.067
num_ppl_hh	730	830	7.905	8.741	-0.835	-1.163	-0.507
test_observed	730	830	0.925	0.925	-0.001	-0.027	0.025
clustercode	730	830	9.500	7.024	2.476	2.031	2.921
chagcharan	730	830	0.429	0.663	-0.234	-0.282	-0.186
formal_school	730	830	0.264	0.731	-0.467	-0.511	-0.423
nearest_scl	730	830	3.149	2.881	0.268	0.157	0.379
test_score_normalized	675	768	0.006	0.586	-0.580	-0.687	-0.473
sheep_per_hh_member	730	830	0.817	1.142	-0.325	-0.468	-0.182

```

kable(round(cor(afghan[, c("formal_school", "nearest_scl", "heads_child", "girl",
  "age_child", "age_head", "yrs_ed_head", "jeribs", "num_sheep", "duration_village",
  "farsi", "tajik", "farmer", "num_ppl_hh")])), digits = 2))

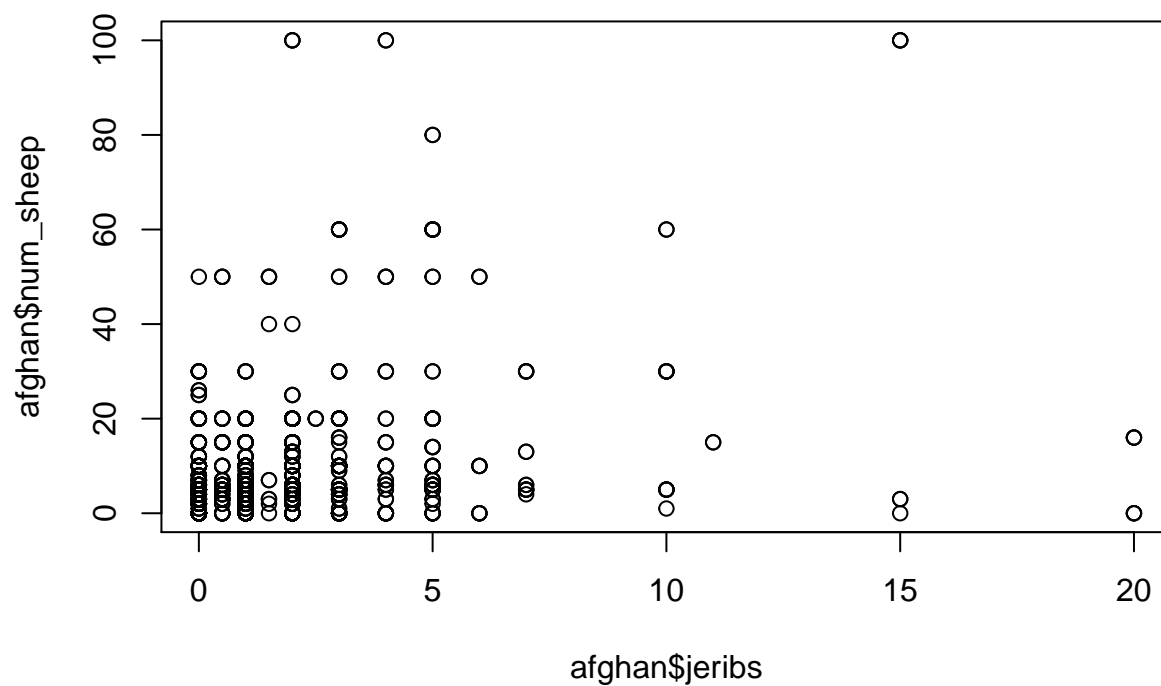
```

	formal_school	nearest_scl	heads_child	girl	age_child	age_head	yrs_ed_head	jeribs	num_sheep
formal_school	1.00	-0.12	0.00	-0.10	0.16	-0.03	0.05	0.00	0.00

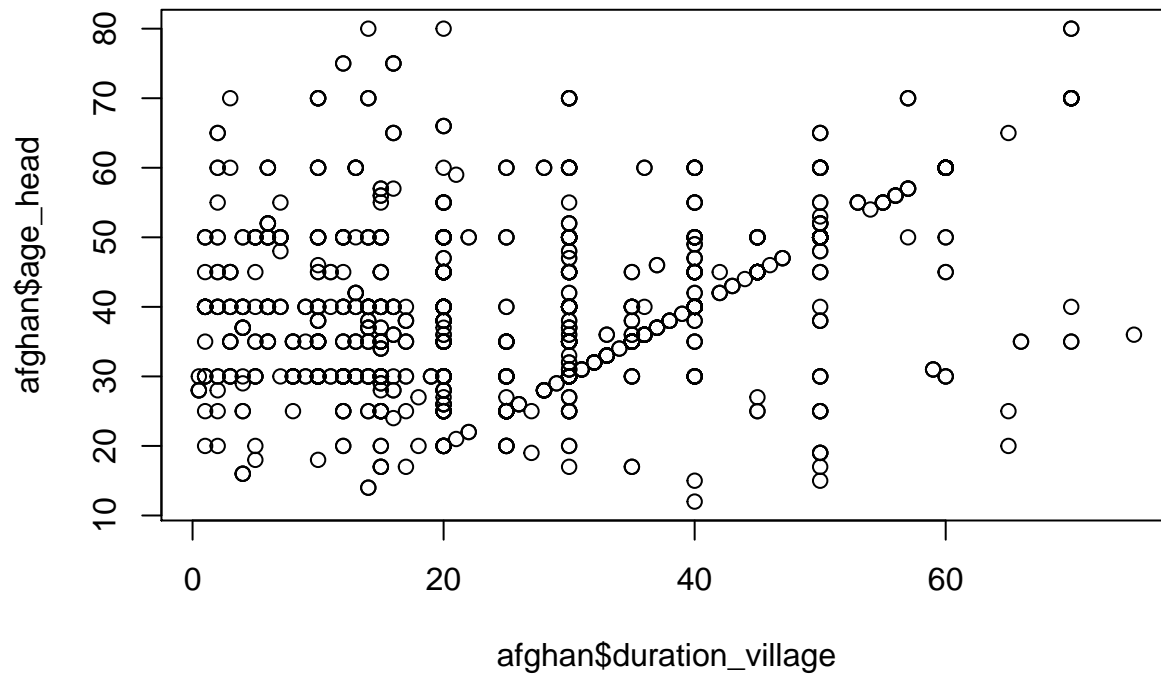
	formal_school	nearest_scl	heads_child	girl	age_child	age_head	yrs_ed_head	jeribs	num_sheep
nearest_scl	-0.12	1.00	0.04	-0.02	0.01	0.03	-0.01	0.01	
heads_child	0.00	0.04	1.00	0.02	0.00	0.12	0.01	0.00	
girl	-0.10	-0.02	0.02	1.00	0.01	-0.01	0.00	0.03	
age_child	0.16	0.01	0.00	0.01	1.00	0.07	0.01	0.00	
age_head	-0.03	0.03	0.12	-0.01	0.07	1.00	0.02	0.08	
yrs_ed_head	0.05	-0.01	0.01	0.00	0.01	0.02	1.00	0.05	
jeribs	0.00	0.01	0.00	0.03	0.00	0.08	0.05	1.00	
num_sheep	0.13	-0.03	-0.05	0.03	0.02	0.09	0.14	0.32	
duration_village	0.02	-0.06	-0.04	0.01	0.02	0.31	0.00	0.04	
farsi	-0.02	0.02	0.02	0.03	-0.01	-0.01	-0.04	0.01	
tajik	0.03	0.06	-0.02	0.00	-0.01	0.08	0.01	-0.07	
farmer	-0.07	0.08	-0.01	-0.01	-0.03	0.13	-0.28	0.01	
num_ppl_hh	0.06	-0.08	-0.20	0.05	0.01	0.09	0.21	0.11	

none are more than 0.35. above magnitude 0.25 are: yrs head of household education and farmer -0.28, farsi and tajik -0.27, duration in village and age of household head 0.3, sheep and jerobs 0.32.

```
plot(afghan$jeribs, afghan$num_sheep)
```

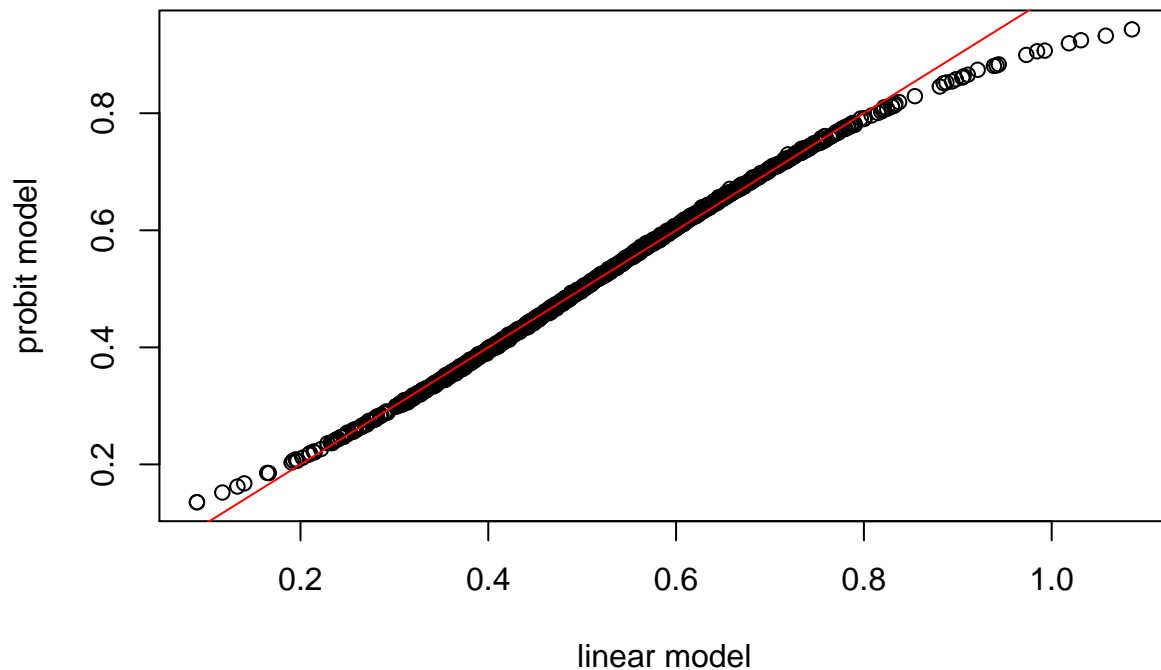


```
plot(afghan$duration_village, afghan$age_head)
```



WHY CHOOSE PROBIT? PLOT the RESIDUALS? cross ref with balance tables fixed effects for village
 nearest_scl, girl, age_child, age_head, num_sheep all significant

```
plot(predict(r2, type = "response"), predict(p2, type = "response"), xlab = "linear model",
      ylab = "probit model")
abline(a = 0, b = 1, col = "red")
```



we can see the difference in the tails

```
linearHypothesis(p2, c("tajik = 0", "farsi = 0"), test = "F")
```

```
## Linear hypothesis test
```

Table 3:

	<i>Dependent variable:</i>				
	formal_school				
		<i>OLS</i>		<i>probit</i>	
	(1)	(2)	(3)	(4)	(5)
Constant	0.671*** (0.036)	0.239** (0.097)	0.405*** (0.102)	0.440*** (0.092)	−0.685*** (0.258)
nearest_scl	−0.053*** (0.011)	−0.051*** (0.011)	−0.020* (0.011)	−0.136*** (0.029)	−0.139*** (0.029)
girl		−0.114*** (0.025)	−0.116*** (0.021)		−0.303*** (0.065)
age_child		0.051*** (0.007)	0.051*** (0.006)		0.134*** (0.020)
age_head		−0.003** (0.001)	−0.002* (0.001)		−0.008** (0.003)
num_sheep		0.005*** (0.001)	0.001 (0.001)		0.015*** (0.003)
jeribs		−0.009 (0.006)	0.008 (0.005)		−0.024 (0.016)
yrs_ed_head		0.003 (0.003)	0.003 (0.003)		0.009 (0.009)
heads_child		0.062 (0.046)	−0.008 (0.040)		0.170 (0.124)
duration_village		0.001 (0.001)	−0.001 (0.001)		0.002 (0.002)
num_ppl_hh		0.006 (0.004)	−0.001 (0.003)		0.017 (0.011)
tajik		0.042 (0.031)	0.037 (0.027)		0.112 (0.082)
farsi		−0.014 (0.032)	−0.004 (0.027)		−0.034 (0.084)
as.factor(clustercode)2			−0.091 (0.071)		
as.factor(clustercode)3			−0.615*** (0.072)		
as.factor(clustercode)4			0.015 (0.068)		
as.factor(clustercode)5		5	0.191*** (0.068)		
as.factor(clustercode)6			0.226*** (0.068)		

```
##
## Hypothesis:
## tajik = 0
## farsi = 0
##
## Model 1: restricted model
## Model 2: formal_school ~ nearest_scl + girl + age_child + age_head + num_sheep +
##     jeribs + yrs_ed_head + heads_child + duration_village + num_ppl_hh +
##     tajik + farsi
##
##   Res.Df Df       F Pr(>F)
## 1    1549
## 2    1547  2 1.2658 0.2823
```

```
linearHypothesis(p2, c("num_sheep = 0", "jeribs = 0"), test = "F")
```

```
## Linear hypothesis test
##
## Hypothesis:
## num_sheep = 0
## jeribs = 0
##
## Model 1: restricted model
## Model 2: formal_school ~ nearest_scl + girl + age_child + age_head + num_sheep +
##     jeribs + yrs_ed_head + heads_child + duration_village + num_ppl_hh +
##     tajik + farsi
##
##   Res.Df Df       F    Pr(>F)
## 1    1549
## 2    1547  2 10.771 2.262e-05 ***
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
```

jeribs and sheep jointly significant farsi and tajik not.

```
detach(afghan)
```