## Preliminary Thesis Defence

Supervisor: Jean-Louis Arcand<sup>1</sup>

Second Reader: Ugo Panizza<sup>2</sup>

Bastiaan Quast<sup>3</sup>

The Graduate Institute, Geneva

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 $<sup>1.\</sup> Professor \ of \ Economics, \ The \ Graduate \ Institute, \ Geneva; \ jean-louis.arcand@graduateinstitute.ch$ 

<sup>2.</sup> Professor of Economics, The Graduate Institute, Geneva; ugo.panizza@graduateinstitute.ch

<sup>3.</sup> PhD Student, The Graduate Institute, Geneva; basti-aan.quast@graduateinstitute.ch / bquast@gmail.com

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### Chapter 1

### Introduction

In this Preliminary Thesis Defence I present the research projects that I intend to use for my PhD dissertation. These projects are titled:

- Additional South African Evidence on Pensions and Child Growth (2)
- Replication: Surviving Andersonville (3)
- Risk and Uncertainty in Unique Equilibria in Currency Attacks (4)
- Bitcoin and Remittances: The Potential of 'Stupid Phones' (5)

These project are in various stages of completion. Below I will briefly describe the research idea, the current state, and the potential for each project.

Firstly, the paper Additional South African Evidence of Pensions and Child Growth builds Duflo (2000, 2003). These papers look at the effect of the gender of grandparents on the growth metrics of their grandchildren. A problem in this comparison lies in the fact that pension eligibility of men was at 65 years, whereas it was 60 for women. This paper makes use of a Household Survey from 2008, 2012 and 2013. The survey is especially of interest, because the pension eligibility age for men was lowered from 65 to 60 in 2009. As it stands now I have analysed the data from 2008 and 2012. The 2013 data was released several weeks ago, I will incorporate these data in future versions of my analysis.

Secondly, together with several other PhD students we have replicated the paper "Surviving andersonville: the benefits of social networks in pow camps" by Costa and Kahn (2007). We were able to replicate all results from the paper, save for a few decimal numbers, which we have taken to be the result of rounding errors. However, replicating these numbers required us to take a number of unorthodox steps in our analysis. When in stead, we take more orthodox steps, we find that we cannot quantitatively and qualitatively replicate the authors' results. As an example, we find that the dataset distinguishes between two different POW camps both located in the town of Andersonville. The authors however, aggregate these two. This leads to overstated magnitudes of the social ties of POWs. This is problematic because the main finding of the paper is that the size of these social networks is relevant to an individual's odds of survival. At this point our replication is quite complete. Before rewriting this paper, I will redo the analysis in R (R Core Team 2013), currently the original and our replication are in Stata.

Thirdly, Morris and Shin (1998) claims that introducing a measure of risk in a model of currency attacks, leads to a unique equilibrium. It thus solves the previous multiple-equilibrium zone called 'ripe for attack' for a unique equilibrium. I believe that this is a result of the fact that the risk factor introduces replaces uncertainty, not certainty. We thus gain information. I want to discuss MS1998 in light of the distinction between Knightian uncertainty and quantified risk

Fourthly, Bitcoin is the first of a new breed of currencies, commonly referred to as a cryptocurrencies. Bitcoin transactions are conducted using an electronic process called signing. I would like to study the role of Bitcoin in remittances. For this I would like to participate in building Bitcoin applications for the simple type of phones common in developing economies (sometimes referred to stupid phones). We could study the spread of bitcoin by looking at the downloads of the apps from regions, as well looking at how releasing the app in different languages evolves.

After this the papers follow, in the order listed above. A separate citations section is included for each chapter. For ease of reference, the titles of the citations in the bibliography link to the online articles using DOIs and URLs. In the end notes (6) I present a brief discussion of my dissertation, as it stands now, a whole. I also mention some very preliminary ideas.

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### Chapter 2

# Pensions and Child Growth in South Africa

### Abstract

In this paper I look at the effect of the gender of pension recipients on the growth of children in the same households.

I do this by comparing z-scores of anthropometrics of South African children living in the same household as state pension recipients. This paper exploits the fact that the data set consists of two surveys which were done before and after the lowering of the pension eligibility age for men to the same age as women.

The main preliminary finding is that the household effect was only significant in 2012.

### 2.1 Introduction

This paper looks at the effect of the gender of pension recipients on the growth of children in their household in South Africa. The approach is very similar to Duflo (2000, 2003). The deviation from international standards (Onis et al. 2006) for weight-for-height and length-for-age are computed as z-scores. These are then compared for different pension recipient status and gender.

The anthropometrics are useful for computing z-scores. These z-scores are considered a good representation of short-term or long-term malnutrition respectively, especially for children between 6 and 60 months old.

The South African pension is a interesting variable to measure income because of its criteria. Besides a maximum level of income, the only criterium is the age of a person. Because of this the status as a recipient is quite exogenous and there are few selection bias issues. The problematic difference between the eligibility age of men and women was eliminated between the two surveys which creates an interesting natural experiment.

Duflo finds evidence in South Africa's 1993 Integrated Household Survey that girls' short term nutrition (weight-for-height) was positively influence by living with the maternal grandmother if the grandmother was eligible for a state pension. This is directly after the significant increase in the pension sum for

blacks. The pension-eligibility age at this time was 60 for women and 65 for men.

This study deviates from the Duflo study in several ways. In 2008 and 2012, the first and second wave of the Southern Africa Labour and Development Research Unit (2008, 2012) have gathered similar data. In the period 2008-2010, the government lowered the eligibility age for men from 65 to 60 (Announcement).

This happened in a few steps. As of July 16th 2008 men aged 63 and 64 were eligible for a pension. Men aged 61 and 62 became eligible in April 2009. Finally in January 2010, pension eligibility age was at 60 for all citizens.

Another deviation is the usage of WHO z-scores (Onis et al. 2006) in stead of CDC z-scores (Kuczmarski et al. 2000), since these have superseded the CDC charts, however this should not be of any consequence, as long as we use the same standards consistently.

The main preliminary result is that the household effect (i.e. having one or more recipients in the household) is very insignificant in the 2008 estimate. But in the 2012 estimate it is very significant.

### 2.2 Data

In this paper I use data from two sources. The first is the South African National Income Dynamics Survey (Southern Africa Labour and Development Research Unit 2008, 2012) and the second is the World Health Organization's Child Growth Standards (Onis et al. 2006).

The main source of data is the NIDS. This survey collects data on a representative set of appproximately 10,000 South African households. The primary information variables that I use are, the child anthropometrics, the age and gender of household members, and the status as state pension recipients.

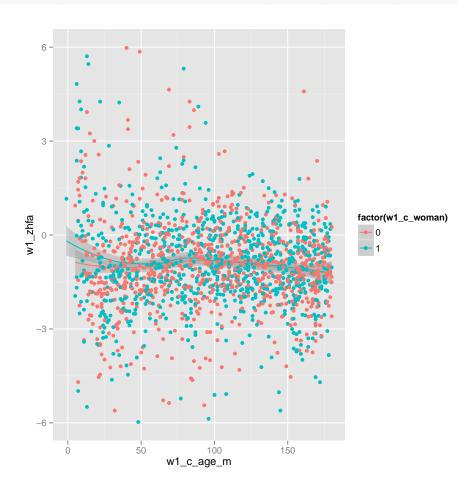
For adults, several variables measure the different amounts and sources of income. Among those, a variable for the adult receiving a state pension, and if so, how much. This is a numeric variable, the values of which lie very close together. For simplicity I have temporarily used this variable as a dummy.

The children's anthropometrics taken are, length/height, weight, and waist. Using these anthropometics and WHO growth standards, z-scores have been calculated. Unfortunately, the latest version of wave 2 (2012) accidentally omitted the z-scores, so that these cannot be evaluated until an updated version is published. However, I have computed the length-for-age z-scores manually.

In 2006 the WHO published its standards for child growth. These standards are based on the scores of children from different ethnic populations in households which maintained a healthy lifestyle. The standards provide the means and standards deviations used. These are on a monthly basis for height-for-age, and on a semi-centimeter level for weight-for-height scores.

```
p1 <- ggplot(subset(w1_child, w1_woman_60 == 1))
p1 <- p1 + aes(w1_c_age_m, w1_zhfa, colour = factor(w1_c_woman))
p1 <- p1 + stat_smooth(method = "loess") + geom_point()
p1
## Warning: Removed 324 rows containing missing values (stat_smooth).</pre>
```

```
## Warning: Removed 263 rows containing missing values (stat_smooth).
## Warning: Removed 51 rows containing missing values (stat_smooth).
## Warning: Removed 638 rows containing missing values (geom_point).
```



### 2.3 Results

Basic HAZ (2008)

```
summary(w1_haz0)
##
## Call:
## lm(formula = w1_zhfa ~ w1_spen_w + w1_spen_m + w1_h_tinc + w1_best_edu +
       w1_best_age_yrs, data = w1_child, subset = w1_c_age_m >=
##
##
       6 & w1_c_age_m <= 60)
##
## Residuals:
##
   Min
             1Q Median
                            3Q
                                  Max
## -4.779 -1.036 -0.169 0.834 7.060
```

```
##
## Coefficients:
##
                   Estimate Std. Error t value Pr(>|t|)
## (Intercept)
                  -1.43e+00 1.44e-01 -9.87
                                                <2e-16 ***
                   2.32e-02 1.15e-01
                                         0.20
                                                0.8402
## w1_spen_w
## w1_spen_m
                   1.36e-01
                             1.72e-01
                                         0.79
                                                0.4281
                   3.62e-05
                              9.99e-06
                                         3.62
                                                0.0003 ***
## w1_h_tinc
## w1_best_edu
                   1.63e-03
                              7.84e-03
                                         0.21
                                                0.8355
## w1_best_age_yrs 7.61e-03
                              3.64e-03
                                         2.09
                                                0.0369 *
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
##
## Residual standard error: 1.77 on 1436 degrees of freedom
   (1936 observations deleted due to missingness)
## Multiple R-squared: 0.0134, Adjusted R-squared: 0.00994
## F-statistic: 3.89 on 5 and 1436 DF, p-value: 0.00164
```

HAZ 2008, with 2012 eligiblity as an IV

```
summary(tsls_w1w2_haz0)
##
##
   2SLS Estimates
##
## Model Formula: w1_zhfa ~ w1_spen_w + w1_spen_m + w1_h_tinc + w1_best_edu + w1_best_age_
##
## Instruments: ~w2_spen_w + w2_spen_m + w1_h_tinc + w1_best_edu + w1_best_age_yrs
##
## Residuals:
##
   Min. 1st Qu. Median
                             Mean 3rd Qu.
  -4.990 -0.835 -0.050
                                    0.788
##
                            0.000
                                          7.070
##
##
                    Estimate Std. Error t value Pr(>|t|)
## (Intercept)
                  -1.172e+00 7.388e-02 -15.861 < 2e-16 ***
## w1_spen_w
                   1.748e-02 9.477e-02
                                         0.184 0.8536
                  -1.374e-01 1.444e-01 -0.952
## w1_spen_m
                                                  0.3414
                   2.995e-05 5.606e-06
## w1_h_tinc
                                        5.342 9.69e-08 ***
## w1_best_edu
                   2.410e-03 3.532e-03
                                          0.682
                                                  0.4951
## w1_best_age_yrs 4.127e-03 1.863e-03
                                          2.215
                                                  0.0268 *
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
## Residual standard error: 1.4889 on 4227 degrees of freedom
```

HAZ 2008, with 2012 eligiblity as an IV (men over 65 only)

```
summary(tsls_w1w2_haz1)
##
## 2SLS Estimates
```

```
## Model Formula: w1_zhfa ~ w1_spen_w + w1_spen_m + w1_h_tinc + w1_best_edu + w1_best_age_
## Instruments: ~w2_spen_w + w2_spen_m_65 + w1_h_tinc + w1_best_edu + w1_best_age_yrs
##
## Residuals:
## Min. 1st Qu. Median
                          Mean 3rd Qu.
                                          Max.
## -4.990 -0.836 -0.050 0.000 0.786 7.040
##
##
                   Estimate Std. Error t value Pr(>|t|)
## (Intercept)
                 -1.173e+00 7.387e-02 -15.880 < 2e-16 ***
## w1_spen_w
                  8.576e-03 9.541e-02
                                       0.090 0.9284
                 -9.189e-02 1.348e-01 -0.681 0.4956
## w1_spen_m
                  2.992e-05 5.605e-06
                                       5.339 9.85e-08 ***
## w1_h_tinc
                  2.443e-03 3.531e-03
                                       0.692 0.4890
## w1_best_edu
## w1_best_age_yrs 4.092e-03 1.860e-03
                                       2.200 0.0278 *
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
## Residual standard error: 1.4885 on 4227 degrees of freedom
```

# Bibliography

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### Chapter 3

# Replication: Surviving Andersonville

Aksel Erbahar, Cecilia Heuser, Victor Kümmritz, Bastiaan Quast

#### Abstract

We replicate Costa and Kahn (2007). We are able to replicate all the result from the paper. The authors make a number of choices in order to arrive to the results published. We raise some concerns regarding some of these choices. For example, the authors treat the POWs of the two Andersonville camps as if they were in the same camp. This inflates size of the POWs social network, which is used as the explanatory variable. When we make choices which to us seem more defendable, we cannot, quantitatively and qualitatively, replicate the authors' results.

### 3.1 Summary of the paper

Costa and Kahn (2007) try to estimate the effect of quality and size of social networks on ensuring the survival of prisoners of war (POW) in POW camps. To examine the relationship the authors combine two datasets, a longitudinal dataset of Union Army soldiers and a cross-sectional dataset of the POW camp in Andersonville.

The empirical specification for the longitudinal data that measures the effect of the size of the network is as follows:

$$h(t) = \exp(\beta_1 F + \beta_2 I + \beta_3 M) \tag{3.1}$$

where h is hazard at time t, F is the number of friends (=social network), I are individual characteristics and M macro camp conditions. The number of friends is measured as the number of POWs of the same company and varies by month due to deaths or camp transfers. As it might capture the lagged mortality of the group, the authors use as second strategy the initial number of friends as a time-invariant proxy. In addition, they instrument for the number of friends using the number of net camp transfers combined with a dummy

indicating whether the POW was transferred to account for omitted variables. The specification for the Andersonville data in turn is a probit model:

$$Pr(S=1) = \Phi(\beta_1 F + \beta_2 F) \tag{3.2}$$

$$Pr(S=1) = \Phi(\beta_1 F_i + \beta_2 F_{ij} + \beta_3 I | ethnicity = j)$$
(3.3)

where equation Equation 3.2 examines quantity and Equation 3.3 quality of the social network. The measure for number of friends here is the number of POWs from the same company in Andersonville.

The longitudinal data indicates that POWs had special characteristics. For instance, they were likely to be volunteers, and from companies with more wounded or dead. POWs with more friends were typically US-born and wealthier while Irish and older men had less friends. Concerning survival rates, Kaplan-Meier hazard rates show that POWs captured later (after 1963 when the Union and the Confederate Army stopped exchanging POWs) have lower survival rates. They also show that survival rates were higher for POWs with 10 or more friends. In addition, the rates show that it takes 50 days until there is a divergence in survival between POWs with and without friends. The exponential function estimates that an additional friend leads to a 0.98 times lower mortality hazard. An increase in the number of friends from 0 to 5 (5 to 10), decreases the predicted probability of death from 0.31 to 0.28 (0.26) while a spline specification provides evidence that the effect is greatest for the first two friends. In addition, survival is more likely for POWs that had survived at least one or two months. Factors increasing mortality are the number of men in the camp, low rank, high age, and height among others. Insignificant variables are for instance wealth and marital status. There is no evidence for individual heterogeneity. The use of a Weibull specification indicates no duration dependence (toughen up effects). Interestingly though, a Cox model gives no significant effect of friends which the authors interpret as a result of their loss of power due to the small sample size. Robustness checks, including the IV approach and the effect of friends transferred in, confirms the significant effect of friends. Finally, the cross-sectional results provide evidence that having the same last name, being from the same town for smaller towns, ethnic similarity and having a sergeant or a higher rank in one's network are all important factors in raising survival probabilities which in turn shows that the quality of social networks matters.

In summary, Costa and Kahn are able to show that quantity and quality of social networks mattered for survival in civil war POW camps. Potential explanations for this are the sharing of scarce resources, moral support and protection from other prisoners.

#### 3.2 Data

The raw data for the first part of the paper is extracted from the Union Army dataset readily accessible at http://www.cpe.uchicago.edu. This dataset draws information from censuses, medical records and military pension records linking military, socioeconomic and health information for nearly 40,000 white males that served in the Union Army during the Civil War. For the second part, the Andersonville database is available at http://www.itd.nps.gov/cwss but

only as a "searchable version", which allows viewing the information for one soldier at a time, and more convenient formats are not readily available.

The datasets provided for the estimations alongside with the publication are already partially processed parts of the raw data available online. No clear guidance is given as to what steps were taken to go from the raw data to the files provided, and matching both things proved to be less than straightforward. In view of this, we decided to proceed with the replication using the files provided by the authors, pointing out along the way the cases where potential problems in them seemed likely given the raw data we observed. Taking those files as starting points, it is possible to reproduce the tables and graphs published in the paper, so in this sense we can say that the data set is complete. Originally, some of the data required by the published .do files was not included in the published data files, but the authors provided it promptly upon our request and added it subsequently to the online files of the publishing journal.

The data and .do files provided do not describe or label many of the variables used, nor does the limited variable description in the Appendix cover all of them. A very thorough description of the variables in the raw data set can be found at its online source, but the match between this and the variables in the files provided is not straightforward or complete, since some of them are already created by the authors from the raw data. The description of the data itself, mainly of the variables that are used most often, is succinct but adequate, with Table 1 and Table 2 presenting some relevant descriptive traits. Despite this, some attention should be drawn to the fact that some of the variables have a relevant share of missing values (only the highest number of observations is reported), a point that will be commented in detail later on.

### 3.3 Stata code and interpretation

All codes run to their full extent, and produce the estimations presented in the paper, with minor differences that we describe in detail below. The codes themselves are not commented at all and include plenty of estimations and specifications not included in the published paper, as well as unexplained data processing steps. No exporting commands were set up, or log files kept, which might be the root of some of the rounding and significance discrepancies we have found.

In what follows, all reproduced tables are presented with a comment on the differences found (in bold), whenever there were any.

#### **3.3.1** Tables

Table 1: This table presents the means of most variables later used for estimation, dividing observations in POWs and NON POWs, to illustrate ex ante differences in observables between them.

We have added to Table 3.1 the number of observations per variable, not originally included in the paper, in order to highlight the fact that some of them have significant amounts of missing values, something that should be kept in mind later at the estimation stage. In this table, the case in point is Household property income in 1860, which is used in most of the specifications proposed, but as will be discussed for later tables, this is a pattern common to all the

Table 3.1: Characteristics of Soldiers by POW Status

Table 5.1. Characteristics c	n boluleis	$_{\rm Dy}$ 1 $_{\rm OW}$	Dualus			
	All	Obs.	Never POW	Obs.	POW	Obs.
US born	0.745	35007	0.745	31967	0.743	3040
US born corrected	0.747	34941	0.745	31966	0.759	2975
Irish	0.087	34941	0.086	31966	0.102	2975
German	0.074	34941	0.075	31966	0.062	2975
British	0.039	34941	0.039	31966	0.033	2975
Other	0.054	34941	0.055	31966	0.043	2975
Artisan	0.2	34941	0.199	31966	0.211	2975
Farmer corrected	0.505	34941	0.505	31966	0.508	2975
Professional or proprietor	0.075	34941	0.077	31966	0.061	2975
Laborer	0.212	34941	0.212	31966	0.212	2975
Unknown	0.007	34941	0.007	31966	0.008	2975
Enlisted in 1861	0.21	35007	0.205	31967	0.263	3040
Enlisted in 1861 corrected	0.21	34878	0.205	31906	0.269	2972
Enlisted in 1862	0.344	34878	0.331	31906	0.487	2972
Enlisted in 1863	0.068	34878	0.066	31906	0.087	2972
Enlisted in 1864	0.256	34878	0.266	31906	0.147	2972
Enlisted in 1865	0.122	34878	0.132	31906	0.009	2972
Volunteer	0.909	34941	0.905	31966	0.951	2975
Height in inches	67.599	34941	67.589	31966	67.709	2975
Household property income in 1860	534.155	13769	531.734	12509	558.2	1260
Company birthplace fragmentation	0.642	34941	0.644	31966	0.62	2975
Company occupation fragmentation	0.559	34941	0.558	31966	0.57	2975
Fraction company died as non-POWs	0.135	34941	0.131	31966	0.182	2975

variables imported from census data. Additionally, considering the number of observations for each of the variables leads to the suggestion of a small correction for three of the dummy variables describing categories: US born, farmer and enlisted in 1861. The initial data file is missing these variables, which are likely to have been dropped as the basis category for estimation purposes in some other use of the data. They were then rebuilt in the .do file from the remaining categories in such a way that generated zeroes for some observations that should have been missing (except for farmer, which is not included at all in the file). For example: as provided by the code, US born has 35,007 observations, whereas other nationality dummies, all built from the same original variable, have 34,941. The correction proposed then, is to set these dummies to missing whenever the other categories of their class are missing, which slightly changes their descriptive statistics (for example the mean of US born goes from 0.745 to 0.747 when this correction is implemented).

Remaining discrepancies are minor and could be due to some kind of rounding difference. An alternative explanation for these differences is that the table was produced from a slightly different dataset. Considering that even the most populous variables present over 500 observations less than the amount declared in the paper, and the fact that one of the variables (farmer) is not included in the data file at all, we consider the second option to be more likely, which would also explain the minor differences in the means of Artisan, British, Height in inches, etc.

A last and minor comment is that the inclusion of the variable volunteer is surprising, since by sample design the Union Army dataset was restricted to white volunteer infantry regiments. The inclusion of this variable when comparing POWs and non POWs probably responds to the point raised in the paper about POWs not being representative of all soldiers, for example in ideology (p.1471). A variable that reflects that both POWs and non POWs volunteered in similar proportions would suggest homogeneity between POWs and non POWs in this dimension and, hence, increase external validity. The similarities observed in Table 1 between POWs and non POWs in their mean of volunteer do not reflect that, since they are both close to one by construction. Any individuals not listed as volunteers, either correspond to the very few drafted men, or are actually soldiers that re-enlisted as commissioned officers, but were originally volunteers, as explained in the codebooks for the source data.

3.2: This table describes the variables later used in the main regressions, focusing in this case only on POWs. It also presents separately their mean and standard errors for the subsamples of POWs with few (less than 3) and many friends (three or more).

This table is almost exactly reproduced, except for the minor differences set in bold, which appear to be rounding differences (and a typo in the case of Laborer). The number of observations stated on the table in the paper (1923) corresponds to the last variable in this case as well, even though, as mentioned for the previous table, it is relevant to keep in mind that some of the other variables of interest show a considerably lower count of observations, as can be seen in the added columns. For this table, this is the case of variables Married in 1860 and Household property income in 1860, which are both variables from the 1860 census. The main concern regarding this table is the process of organizing the data, particularly one step in which a merge to the file "transfer.dta" is conducted. This file contains the prisoner identifier variable, month, year, and a dummy variable reflecting whether the prisoner was transferred (transferin). This variable is not needed for Table 3.2, and we can only speculate that it was incorporated, as some other steps were, in an attempt to exactly reproduce the dataset used in Table 3.3. The problem in this case is that the file "transfer.dta" contains duplicate observations, which in turn duplicates observations in the main data set via the merge, artificially inflating the number of observations in the data used for Table  $3.2^1$ .

If these duplicate observations are eliminated from the "transfer.dta" file before the merge, the statistics presented do not seem to defer significantly, and certainly neither do the conclusions drawn from them, but the number of observations in the subsample considered is significantly lower. This exercise is presented in the table below.

Two additional remarks related to this are: a) whenever month was larger than 12, it is set to missing, b) all observations marked as having occurred in 1861 are shifted to 1862. Neither month nor year are directly used for this table, but they are the matching points for the merge to the "transfer.dta" file discussed above. The file transfer.dta also contains month; 12 and observations for 1861, and they are not replaced in a similar fashion, introducing some additional artificial matching problems into the merge operation. 3 Besides

<sup>1.</sup> Duplicate observations per month-year-prisoner are natural in the context of Table 3.3, because in there capture time is measured per fortnight. Including additional observations because of this in a stage of data description such as this one is hardly appropriate.

No. obs. 986 986 986 986 986 986 986 986 976 976 951 986 986 986 988 986 986 Many friends (>=3)Std. err. 2348.6760.4530.4980.207 0.4030.2450.2046.6046.8330.4310.3310.211 0.2550.4270.2840.0570.2060.160.4971.356 661.711 25.265Mean0.0640.288 0.044 0.4570.0260.047 0.2040.401 0.239Table 3.2: Characteristics of POWs by Number of Friends in First Two Weeks of Captivity 0.045 0.088 0.0850.6070.07 No. obs. 990 990 990 990 990 990 990 990 990 391 990 990 985 985 391 974 1084.987 Std. err. Few friends (<3)0.4557.4150.3190.2020.2230.4970.2660.4290.1570.4480.273 6.3840.3560.1930.2760.41 0.07 0.5 483.60926.645171.79 Mean 0.4930.1150.0420.0530.2140.2430.0250.0830.2760.1480.0930.5470.077 0.0810.44 No. obs.  $\begin{array}{c} 817 \\ 1966 \end{array}$ 1976 1976 1976 1976 1976 1976 1976 1976 1976 1976 1925 1976 1976 9261 817 Std. err. 1855.699 0.1820.444 0.2430.1820.2170.4070.4940.2560.442 7.0566.6120.2660.4370.3230.3250.0640.5 0.2 171.576 576.4750.26625.960.076Mean 0.0630.2090.0340.4750.2570.1180.0890.5420.0340.4210.731 0.12 0.05 0.07 Commisoned or noncommisoned officer Fraction company dead before capture Company occupational fragmentation Household property income in 1860 Company birthplace fragmentation Wounded 10 days before capture Professional or propietor Height when captured Age when captured Enlisted in big city Married in 1860 Jnknown US born aborer German Artisan Farmer British Other  $\operatorname{Irish}$ 

Table 3.3: corrected

			3						
	Mean		No. obs.	Mean	Std. err.	No. obs.	Mean	Std. err.	No. obs.
US born	0.732	0.443	1470	0.715	0.452	727	0.748	0.434	743
Irish	0.122		1470	0.113	0.317	727	0.131	0.337	743
German	90.0		1470	0.074	0.262	727	0.046	0.209	743
British	0.034		1470	0.04	0.196	727	0.028	0.166	743
Other	0.05		1470	0.056	0.231	727	0.044	0.206	743
Artisan	0.212		1470	0.217	0.413	727	0.207	0.406	743
Farmer	0.427		1470	0.442	0.497	727	0.413	0.493	743
Professional or proprietor	0.065		1470	0.073	0.26	727	0.058	0.234	743
Laborer	0.265		1470	0.242	0.429	727	0.287	0.453	743
Unknown	0.031		1470	0.026	0.16	727	0.035	0.184	743
Enlisted in big city	0.48		1470	0.486	0.5	727	0.475	0.5	743
Household property income in 1860	547.314		615	476.274	1107.659	299	614.532	2014.738	316
Age when captured	25.834		1465	26.4	7.263	727	25.276	6.544	738
Height when captured	171.526		1439	171.683	6.433	717	171.37	6.81	722
Commissioned or noncommissioned officer <sup>b</sup>	0.074		1470	0.078	0.269	727	0.07	0.255	743
Married in 1860	0.252		615	0.264	0.442	299	0.241	0.428	316
Wounded 10 days before capture	0.125		1470	0.155	0.363	727	0.096	0.294	743
Fraction company dead before capture	0.091		1470	0.094	0.069	727	0.089	0.056	743
Company birthplace fragmentation	0.542		1442	0.55	0.189	723	0.534	0.207	719
Company occupational fragmentation	0.593		1442	0.585	0.173	723	0.601	0.178	719

a. Company clustered standard errors are in parentheses. Symbols ++, +, and \* indicate statistical significance levels of 1, 5, and 10 percent respectively.

b. Related to the point about the variable Volunteer made before, the name Commissioned or non commissioned officer may be misleading, since commissioned officers are excluded from the sample by construction.

the potential distortions in the merge that these asymmetric replacements may cause, the switch of 1861 to 1862 seems particularly surprising given that no explanation for it is offered.

Additionally, if the aim of this table is to have a general impression of the variables used in the main regressions (Table 3.3), the same observations should have been considered in both accounts. This is not the case, since the observations with an unknown number of friends are dropped for this table, but not for the next one.

Table 3.3: This table shows the results of the hazard rate analysis using a set of covariates described in the previous tables and alternating two measures of friends: number of friends at the time of the observation and initial number of friends.

Table 3.3 is reproduced almost completely, except for the results in bold, for which the significance level differs from the one presented in the publication.

In this case, month larger than 12 is replaced by 99, and in this case as well this might generate distortions since an equivalent change was not performed in the file to which this is merged ("Died.dta"). The observations for which the number of friends is unknown are not dropped here, but set to zero. Whenever the number of deaths in the prisoners' company before capture is unknown, it is set to zero. Whenever the number of men in camp is unknown it is set to 40. Whenever the variables imported from the 1860 census are missing (i.e. there was no match to the census) they are still included in the regression by setting their value to zero in the case of dummy variables (married and illiterate), and by taking log(1+variable) in the case of Household property. In all of these cases, dummy variables are included in the regression indicating whether the data is actually missing (e.g. a dummy variable that takes value one if the observation was not matched to the 1860 census, link60). It is understandable that in order to maintain a healthy sample size, and to use as much of the information as possible, some assumptions are made, but the trade off related to this point is that these assumptions may create artificial noise in the data that would not be fully captured by these control dummies.

Table 3.4: This table presents an alternative estimation strategy. As a benchmark, the effect of the number of friends in the camp is estimated including company fixed effects and the same covariates as before. To avoid endogeneity issues that may arise due to the potential correlation between the current number of friends and the prisoners own unobservable health (via its correlation to the lagged mortality of the group), an IV-hazard rate strategy is pursued next. The instruments chosen are the new number of friends the prisoner has in each period (the newly captured soldiers of his company) and a dummy variable that reflects whether the POW was transferred. Both variables clearly affect the number of friends a POW has, and are meant to be uncorrelated with his unobservable health, since transfers and the amount of newly captured men assigned to each camp were determined by camp needs or evolution of war events5. In the first stage, the number of friends is regressed on the instruments, as well as the whole set of covariates and fixed effects. The predicted residuals of this first stage are then included in the second stage, along with all covariates, fixed effects and the number of friends. This procedure is repeated 100 times, preserving the coefficients and standard errors of the number of friends, the number of men in the camp and the residuals, as well as the R-squared of the first stage. The final result of this Montecarlo procedure is

Table 3.4: Social Networks and Individual Characteristics on Mortality

Table 0.4. DO	Table 9.4. Doctal including and individual Characteristics on mortality	mid midivid	dal Cilalacteris	IOINI INIOI	ranty	
	specification	I	specification 1	II	specification II	H
VARIABLES	Hazard rate	Std. err.	Hazard rate	Std. err.	Hazard rate	Std. err.
Current number of friends	0.983	-0.008	0.977++	-0.009		
Initial number of friends					0.976++	-0.009
Ln(number of prisoners in camp)			1.536++	-0.14	1.521++	-0.139
Fraction of company dying before capture	1.091	-0.782	0.892	-0.636	0.63	-0.449
Professional or proprietor	0.567	-0.146	0.563	-0.143	0.556	-0.141
Artisan	0.944	-0.119	0.947	-0.119	0.937	-0.117
Laborer	1.298	-0.154	1.295	-0.152	1.287	-0.152
a German	1.197	-0.215	1.166	-0.209	1.149	-0.206
Irish	0.768*	-0.121	0.762*	-0.118	0.750*	-0.117
British	0.641*	-0.171	0.654	-0.174	0.656	-0.177
Other	0.658*	-0.154	0.645*	-0.153	0.642*	-0.151
Sergeant, corporal or officer	0.549++	-0.115	0.543++	-0.111	0.541++	-0.111
Age at captivity	1.045++	-0.007	1.044++	-0.007	1.044++	-0.007
Height at enlistment	1.01	-0.007	1.01	-0.007	1.011	-0.007
Observations	23256		23256		23256	
Number of subjects	3026		3026		3026	
Log pseudo likelihood	-1324.607		-1308.229		-1307.17	

a. Company clustered standard errors are in parentheses. Symbols ++, +, and \* indicate statistical significance levels of 1, 5, and 10 percent respectively.

obtained by computing the mean of those variables among the 100 repetitions. Here, the results are replicated entirely.

A concern raised is that it is not clear how the variable that reflects transfers was constructed, since this information is not directly provided in the raw data available online. In some cases, the variable that reflects the camp contains multiple entries per individual, and we can only assume that those were used to infer that the POW was transferred between those camps. This is most likely an accurate interpretation of the data, the only problem being that there is no information about the date of transfer, which makes the instrument weaker.

In the following section, the authors use The National Park Service's cross-sectional data of the population of Andersonville and estimate probit models of the probability of survival on the number of friends and various demographic characteristics as described in the summary.

Table 3.5: This table estimates the effect of social networks on probability of survival controlling for a large of variables that measure existing networks outside of the company.

All figures on the table are replicated perfectly. However, the coefficients in bold are estimated with different significance levels (even though the coefficients and their standard errors are the same). For example, we find that the coefficient on Dummy=1 if town population < 9,552 is significant at the 5 percent level whereas the table in the original paper indicates that it is significant at the 1 percent level in specifications 1, 2, and 3. It is important to note that the difference is not always in the same direction. For instance, we find that the coefficient on French surname in specification 2 is significant at the 10 percent level whereas the original table does not show any significance. Thus, we suspect that this discrepancy might be due to rounding error.

Table 3.6: Here, the authors estimate the same equation in logs and include the two outlier companies that were excluded in Table 5 to show the resulting nonlinearity. In the .do file, the outliers are dropped early on and thus their estimations never include these outliers. We save the dataset with the outliers at an early stage so that we can include them in the estimation.

The first thing to notice is that the number of observations is different. The original paper shows a total of 31,678 observations for the first three specifications, and a total of 12,025 observations for specifications 4 and 5. We have less number of observations mostly due to the 83 observations with missing Fraction of company with rank sergeant or higher variable. We dont know how the authors included these observations in their estimation. A minor difference in the first descriptive column is the mean for Log(number of men with same last name in regiment), which is 0.113 in the paper paper and 0.112 in our data.

All the coefficients in bold are slightly different from the original table; some are different only in their magnitude but some are also different in their level of significance. For example, the coefficient on Log(number of men in regiment) in specification 1 is 0.011 with 5% significance level in the paper, whereas we find a higher and more significant effect. Despite these quantitative differences, the results are not qualitatively different.

Table 3.7: Here, the authors estimate the effect of ethnic networks on probability of survival to show that the quality of the network matters.

The bold coefficients in Table 3.7 are different in significance levels than what the authors report in their original table (all coefficients and standard errors are the same). The most striking one is the Captured 1864 or 1865

Table 3.5: Effect of Social Networks on Mortality, with Company Fixed Effects and Instrumented

	Original		IV	
	Haz. Rate	Std. Err.	Std. Err. Haz. Rate Std. Err.	Std. Err.
<sup>a</sup> Number of friends	0.978*	-0.012	0.895	-0.055
Ln(total number of men in the camp)	1.437++	-0.122	1.537	-0.196
Residual			1.06	-0.071

a. Company clustered standard errors are in parentheses. Symbols ++, +, and \* indicate statistical significance levels of 1, 5, and 10 percent respectively.

Table 3.6: Effect of social networks on probability of survival

						From small town	l town
		Mean	1	2	3	4	22
	Number of men in regiment 10	9.157 $-10.358$	0.004++ $-0.001$				
	Number of men in company	12.899 -15.39		0.003++	0.002++	0.003++	0.002++
	Fraction of company with rank sergeant or higher	0.073	0.120++	0.128++	0.079	0.152	0.085
	Number of men with same last name in regiment	1.19	-0.034	-0.034	-0.032	-0.061 $0.018*$	-0.056
		-0.599	-0.007	-0.007	-0.006	-0.009	-0.009
	Log(number of men in camp from same town)	5.101	-0.003	-0.002	0	0.018*	0.026++
		-1.994	-0.005	-0.005		-0.009	-0.008
	Dummy=1 if town population  9552	0.423	0.037 + 0.014	0.034 + -0.014	0.032 + 0.013		
	Private	0.824					
	Officer	0.003	0.347++	0.347++	0.354++	0.311++	0.328++
a			-0.027	-0.027	-0.021	-0.038	-0.025
	Sergeant	0.068	0.080++	0.080++	0.083++	0.084++	0.088++
			-0.011		-0.011	-0.017	-0.018
	Other rank	0.01	0.028		0.03	0.067	0.046
			-0.03		-0.03	-0.049	-0.05
	Corporal	0.078	0.055++	0.055++	0.046++	0.064++	0.054++
			-0.011		-0.011	-0.017	-0.018
	Irish surname	0.023	0.02		0.017	0.069	0.059*
			-0.019		-0.019	-0.03	-0.03
	German surname	0.043	-0.009		-0.016	-0.001	-0.025
			-0.015		-0.015	-0.024	-0.025
	French surname	0.028	0.028		0.028	0.033	0.032
			-0.017		-0.017	-0.027	-0.028
	Continental surname	0.029	900.0		-0.004	-0.021	-0.029
			-0.018		-0.018	-0.032	-0.032
	State fixed effects?		Z		X	Z	Y
	Pseudo R2		0.043	0.044	0.087	0.048	0.115
	Observations	31336	31336	31336	31330	12002	12002

a. Like in the paper, the estimations exclude the two outlier companies. Company clustered standard errors are in parentheses. Symbols ++, +, and \* indicate statistical significance levels of 1, 5, and 10 percent respectively.

Table 3.7: Effect of social networks on probability of survival, logarithmic form

Table 5.1. Effect of Social fietworks of probability of Survival, fogalithing for in	WOLKS OIL	proparing	or survivar,	logar remini		
					From small town	ll town
	Mean	1	2	3	4	5
Log(number of men in regiment)	3.865	0.014++				
	-1.29	-0.005				
Log(number of men in company)	2.052		0.021++	0.012	0.029	0.022
	-1.18		-0.007	-0.006	-0.012	-0.009
Fraction of company with rank sergeant or higher	0.072	0.134++	0.134++	80.0	0.153	0.084
S	-0.127	-0.034	-0.034	-0.032	-0.061	-0.057
Log(number of men with same last name in regiment)	0.112	0.101++	0.095++	++960.0	0.061++	0.063 + +
	-0.305	-0.012	-0.012	-0.011	-0.018	-0.017
Log(number of men in camp from same town)	5.114	-0.004	0	0.002	0.024	0.030++
	-1.991	-0.004	-0.005	-0.005	-0.009	-0.008
State fixed effects?		Z	Z	Y	Z	Y
Pseudo R2		0.038	0.04	0.084	0.044	0.114
Observations	31688	31605	31604	31598	12002	12002

a. Like in the paper, the estimations exclude the two outlier companies. Company clustered standard errors are in parentheses. Symbols ++, +, and \* indicate statistical significance levels of 1, 5, and 10 percent respectively.

Irish German French	Irish		German		French	
	р	se	р	se	р	se
Number of men in company	0.003*	0.002	0.003	0.001	0.002	0.002
Number of men of own ethnicity in company	0.03	0.036	0.03	0.013	0.019	0.026
a Dummy = 1 if Private	-0.046	0.049	-0.078+	0.037	-0.093+	0.043
From small town	0.1	0.04	0.036	0.031	0.054	0.036
Captured 1864 or 1865	0.239++	0.077	0.282++	0.049	0.388++	0.058
Pseudo R2	0.036		0.059		0.058	
Joint significance test	8.6		22.01		3.2	
Observations	735		1355		698	

a. Company clustered standard errors. Symbols ++, +, and \* indicate statistical significance levels of 1, 5, and 10 percent respectively.

variable for French POWs where the authors find no significance at all and we find significance at the 1 percent level. Since this is too large of a difference to be a rounding error, we suspect that it is a typo.

#### 3.3.2 Robustness check - Logit instead of Probit

As a robustness check, we estimate tables 5-7 with logit instead of probit and results are qualitatively similar. Bold coefficients below show differing levels of significance (only 1-level) when compared to probit.

### 3.4 Conclusion

To sum up our replication, our key message is that while we do find small differences between our results and the published results of Costa and Kahn (2007), we find no evidence that would call their conclusions into question, either qualitatively or quantitatively.

Furthermore, the interpretation of the results seems convincing to us. While they cannot test for how friends ensured survival the mentioned explanations from the supply of food to moral support are very comprehensible. In addition, their study is clearly and quite literally made for survival analysis so we do not see space to improve upon the results by applying a different estimation technique. Costa and Kahn (2007) also apply a wide set of survival analysis tools (e.g. from non-parametric to parametric estimation) so we did not come up with many ideas for robustifying their paper in this direction. Potential future extensions could build on the use of different data sets. A weakness of the paper is clearly that external validity is limited because the authors look at a civil war of the 19th century. For instance, looking at World War I or II data could prove to be fruitful and lead to further insight. While we tried to start with such an extension, we were not able to find a sufficient dataset within this period of time.

To come back to the differences between our replication and the original paper, we consider the most relevant issue the difference in significance levels. Interestingly, when looking into this matter in more detail we find that in almost all cases the p-values are at the margin which clearly points in the direction of a rounding error. We can only speculate that given the lack of exporting commands the reason for this is a certain degree of carelessness and, therefore, would like to emphasize the need of these very exporting commands. Nevertheless, and as mentioned before, the differences do not affect the general message of the paper.

### Appendix: In-text estimation

Most in-text estimations are not included in the .do files provided, therefore some of the results to follow do not exactly reproduce the ones published, probably due to differences in specifications. They can nonetheless generally be replicated in terms of signs and significance.

**Probit statement** page 1474, line 21 "When we run a Probit, in which the dependent variable is POW status and the independent variables are economic

Table 3.9: Effect of social networks on probability of survival, logit

						From small town	l town
		Mean	1	2	3	4	2
Z	Number of men in regiment 10	9.157 $-10.358$	0.018++ $-0.003$				
Z	Number of men in company	12.899		0.013++	0.009++	0.014++	0.010++
		-15.39		-0.003	-0.002	-0.004	-0.003
Ξi	Fraction of company with rank sergeant or higher	0.073	0.495++	0.526++	0.336	0.647	0.387
			-0.145	-0.144	-0.139	-0.266	-0.251
Z	Number of men with same last name in regiment	1.19	0.149++	0.147++	0.158++	0.081*	0.101++
		-0.599	-0.03	-0.03	-0.028	-0.042	-0.038
J	Log(number of men in camp from same town)	5.101	-0.012	-0.01	0	0.075	0.114++
		-1.994	-0.019	-0.019	-0.019	-0.038	-0.034
	Dunmy=1 if town population; $9552$	0.423	0.154	0.145	0.133		
			-0.06	-0.056	-0.054		
Ь	Private	0.824					
0	Officer	0.003	2.342++	2.339++	2.481++	2.043++	2.342++
a			-0.454	-0.455	-0.426	-0.562	-0.502
Ñ	Sergeant	0.068	0.344++	0.344++	0.367++	0.377++	0.407++
			-0.05	-0.05	-0.053	-0.081	-0.087
S	Other rank	0.01	0.109		0.12	0.295	0.2
			-0.128		-0.132	-0.232	-0.231
$\circ$	Corporal	0.078	0.236++		0.201++	0.283++	0.244++
			-0.046		-0.048	-0.077	-0.084
Π	Irish surname	0.023	0.086		0.072	0.31	0.264*
			-0.081		-0.082	-0.14	-0.146
9	German surname	0.043	-0.039	-0.036	-0.07	-0.003	-0.111
			-0.061		-0.061	-0.103	-0.106
Ξi	French surname	0.028	0.113		0.119	0.14	0.152
			-0.073		-0.075	-0.12	-0.127
$\circ$	Continental surname	0.029	0.026		-0.015	-0.093	-0.126
			-0.075		-0.076	-0.134	-0.135
S	State fixed effects?		Z		Y	Z	Y
Ь	Pseudo R2		0.043	0.044	0.086	0.047	0.114
O	Observations	31336	31336	31336	31330	12002	12002

a. There is no explanation in the paper as to why probit was preferred to logit.

Table 3.10: Effect of social networks on probability of survival, logarithmic form, logit

	7	>	_	0	)	
					From small town	ll town
	Mean	1	2	ಣ	4	5
Log(number of men in regiment)	3.865	0.057				
	-1.29	-0.022				
Log(number of men in company)	2.052		0.088++	0.047	0.124	0.085
	-1.18		-0.028	-0.024	-0.051	-0.04
Fraction of company with rank sergeant or higher	0.072	0.559++	0.552++	0.342	0.652	0.383
a a	-0.127	-0.147	-0.145	-0.139	-0.266	-0.251
Log(number of men with same last name in regiment)	0.112	0.438++	0.409++	0.416++	0.267++	0.277++
	-0.305	-0.052	-0.052	-0.049	-0.078	-0.074
Log(number of men in camp from same town)	5.114	-0.018	0	0.006	0.100++	0.131++
	-1.991	-0.018	-0.019	-0.019	-0.039	-0.036
State fixed effects?		Z	Z	X	Z	X
Pseudo R2		0.038	0.04	0.084	0.044	0.113
Observations	31688	31605	31604	31598	12002	

a. Company clustered standard errors are in parentheses. The number of observations for the Fraction of company with rank sergeant or higher variable in the first column is 31605. Symbols ++, +, and \* indicate statistical significance levels of 1, 5, and 10 percent respectively.

Table 3.11: Effect of ethnic networks on probability of survival, logit

Irish German French	Irish		German	,	French	
	p	se	Р	se	Р	se
Number of men in company	0.009	0.007	0.011*	0.006	-0.001	0.007
Number of men of own ethnicity in company	0.011	0.11	0.139	0.06	0.154	0.116
Dummy $=1$ if Private	-0.228	0.214	-0.337+	0.162	-0.445+	0.2
From small town	0.417	0.173	0.154	0.131	0.23	0.154
Captured 1864 or 1865	1.082++	0.347	1.223++	0.227	1.826++	0.307
Pseudo R2	0.032		0.058		0.055	
Joint significance test	3.81		18.22		2.16	
Observations	752		1357		874	

a. Standard errors are clustered on the company. Symbols ++, +, and \* indicate statistical significance levels of 1, 5, and 10 percent respectively.

and geographic characteristics and the number of men in the company who were ever wounded or who ever died, we find that these two company characteristics were the main predictors of POW status. The derivative on the number of men in the company who were ever wounded or who ever died, was 0.257 (robust = 0.257) and the derivative on the number of men who were ever wounded was 0.139 (robust = 0.042)."

Table 3.12: Dete	rminants of POW	Status
	Marginal Effect	Marginal Effect
% in comp who died	0.359***	0.430***
	-0.021	-0.0331
% in comp who wounded	0.123***	0.140***
	-0.0136	-0.022
Includes property in 1860	No	Yes
Observations	34878	13754

Comment on late capture page 1474, line 77 "We also found no evidence of group surrender to become a POW - men who were captured in 1864 and 1865 had more friends, even though a group who surrendered during these years would have no hope of a quick exchange."

**OLS statement** page 1474 line 65 and footnote 22. "When we ran an OLS regression of the number of friends on the covariates we later use in our hazard specification, we found that professionals and proprietors, the Irish, older men, and the recently wounded were less likely to have many friends, whereas those from a large city had more friends"... "The coefficient on recently wounded was -0.879 (= 0.397)."

Predicted probability of death page 1475, line 24. "As the number of friends increases from 0 to 5, the predicted probability of death, using the second specification in Table 3, decreases from 0.31 to 0.28, and as the number of friends increases to 10, the predicted mortality probability falls to 0.26. (The mean number of friends in each month was 5.6, with a standard deviation of 9.2, and the median was 2.)"

The summary statistics mentioned for the variable friends match the initial file, but not the data that is actually included in the regression.

The file "survival.dta" contains the predicted survival probability for individuals with 0, 5 and 10 friends (evaluated at means for the other covariates). The statement did not specify a point in time, but we find a coincidence with the statement at t = 330.76 (average days of imprisonment was 131.62).

Table 3 with regiment fixed effects page 1476, line 2. "Even when we included state of regiment fixed effects, the hazard ratio on the number of friends remained virtually unchanged (e.g. the hazard ratio on the initial number of friends was 0.976, = 0.009)."

Table 3.13: Characteristics of POWs by Number of Friends in First Two Weeks of Captivity and Late or Early Captume

Table 3.13. Characteristics of FOWS by founded of Filehus III Filst 1 we weeks of Captavity and bate of Early Captum	JVVS DY IND	linuer of FIL	ends III ru	SC T WO WE	sers of Cap	uivity and	rate of Ea	ny Captur
		Early capture				Late capture		
	<b>V</b>	3	Ä	= 3	V		\ <u>\</u>	: 3
	Mean	Std. err.	Mean	Std. err.	Mean	Std. err.	Mean	Std. err.
US born	0.706	0.456	0.77	0.421	0.709		0.738	0.44
Irish	0.082	0.275	0.109	0.311	0.136	0.343	0.14	0.347
German	0.108	0.311	0.046	0.21	0.064	0.244	0.043	0.204
British	0.053	0.224	0.021	0.143	0.036	0.186	0.032	0.175
Other	0.048	0.213	0.046	0.21	0.056	0.229	0.047	0.213
Artisan	0.233	0.423	0.2	0.401	0.203	0.402	0.207	0.406
Farmer	0.423	0.495	0.355	0.479	0.451	0.498	0.444	0.497
Prof. or proprietor	0.00	0.286	0.075	0.264	0.069	0.253	0.053	0.225
Laborer	0.235	0.425	0.288	0.453	0.248	0.432	0.288	0.453
Unknown	0.019	0.135	0.081	0.274	0.029	0.169	0.008	0.089
Enlisted in big city	0.545	0.499	0.497	0.501	0.461	0.499	0.42	0.494
Property inc in 1860	444.889	1056.215	703.517	2190.478	502.019	1099.896	620.68	2498.66
Age when captured	26.079	7.152	24.848	6.588	26.995	7.558	25.658	6.601
Height when captured	171.518	6.2	171.377	6.914	171.959	6.495	171.33	6.765
Officer	0.111	0.315	0.092	0.289	0.065	0.247	0.049	0.217
Married in 1860	0.27	0.446	0.246	0.432	0.279	0.449	0.233	0.423
Fraction company dead before capture	0.056	0.054	0.057	0.046	0.116	0.069	0.112	0.054
Company birthplace fragmentation	0.554	0.183	0.516	0.238	0.543	0.199	0.553	0.173
Company occupational fragmentation	0.587	0.173	0.614	0.177	0.586	0.173	0.601	0.168

Table 3.14: Determinants of numb	er of friends
Professional or proprietor	-0.913***
	-0.0979
Irish	-0.267***
	-0.0984
Age at capture	-0.0391***
	-0.00504
Wounded 10 days before capture	-0.831***
	-0.0876
Large city	0.553***
	-0.0649
Observations	23256
R-squared	0.152

Table 3.1	5: Numb	er of Friends
	Initial	In estimation
Mean	5.58	2.87
Std. Dev.	9.22	5.12
Median	2	1

Table 3 with splines page 1476, line 6 and footnote 23 "Our experiments with splines suggested that the marginal effect of a friend on survival was greater for the first two friends than for more." Footnote 23: "The hazard rate on the marginal effect of fewer than three friends was  $0.956 \ (= 0.044)$  and the hazard rate on the marginal effect of three or more friends was  $0.980 \ (= 0.011)$ . Although the first hazard rate was not statistically significantly different from one, the two terms together were jointly significant."

**Weibull specification** page 1477, line 12. "When we use a Weibull rather than an exponential specification, we found no evidence of duration dependence..."

Month dummies page 1477, line 19. "When we included dummy variables in our specification indicating that an individual had survived 1, 2, 3 or more months, we found that those who had survived one or two months were less likely to die than those still in their first month of captivity, but that the advantage of having survived a third month was small and there was no advantage to having survived a fourth month."

Cox Proportional Hazard Model page 1477, line 26 footnote. "We also investigated the use of a Cox proportional hazard model to allow the baseline hazard to rise or fall in any month. Controlling for camp conditions, we obtained a statistically insignificant hazard ratio on friends of 0.987 (= 0.009). We suspect that we are losing power because of our small sample size."

On limiting the sample page 1480, line 17. "When we restricted the sample to exclude deaths after September 1864 and captures prior to October 1864

	Hazard rate Std. err Hazard rate Std.	Std. err	Hazard rate	Std. err	Hazard rate	Std. err
Number of friends	0.984*	-0.009	0.978	-0.009		
Initial number of friends					0.976++	-0.009
Ln(number of prisoners in camp)			1.538++	-0.141	1.525++	-0.14
Fraction of company dying before capture	1.427	-1.227	1.19	-1.011	0.787	-0.653
Professional or proprietor	0.512	-0.134	0.506++	-0.131	0.502++	-0.13
Artisan	0.862	-0.114	0.862	-0.114	0.851	-0.112
Laborer	1.163	-0.148	1.154	-0.146	1.141	-0.145
German	1.135	-0.213	1.116	-0.21	1.103	-0.206
Irish	0.731*	-0.118	0.723	-0.116	0.723	-0.115
British	0.616*	-0.167	0.630*	-0.17	0.637*	-0.174
Other	0.612	-0.145	0.603	-0.144	0.602	-0.143
Sergeant, corporal or officer	0.570++	-0.117	0.561++	-0.113	0.557++	-0.112
Age at captivity	1.042++	-0.008	1.040++	-0.007	1.040++	-0.007
Height at enlistment	$1.014^{*}$	-0.007	$1.014^{*}$	-0.007	1.014*	-0.007
Observations	3026		3026		3026	
Number of subjects	23174		23174		23174	
Log pseudo likelihood	-1307.77		-1291.45		-1290.674	

a. Company clustered standard errors are in parentheses. Symbols ++, +, and \* indicate statistical significance levels of 1, 5, and 10 percent respectively.

Exponential Specification

Exponential Specification

The specification of the specification

Figure 3.1: Exponential specification

Table 3.17: Spli	ine at 3
	Hazard rate
Fewer than 3 friends	0.956
	-0.0443
3 or more friends	0.980*
	-0.0108
Observations	23256
Chi-sq	7.789
Prob ¿ chi-sq	0.0204

because only the dying may have been left at Andersonville once men were transferred out, our results remained unchanged. The derivative of the coefficient on the number of men in the company was 0.003 (sdev=0.001) and the derivative of the coefficient on the number of men in the regiment with the same last name was 0.035 (sdev=0.007)."

On the mortality of privates page 1480, line 54. "The fraction of sergeants or higher rank is not a reflection of own officer mortality. When we restricted the sample to privates, we found that the derivative of this coefficient was 0.115 (sdev=0.054)."

On the role of networks in predicting escape from Andersonville page 1482, line 25. "Also suggestive of friends not always helping survival is that, among the men at Andersonville, we find no evidence that the number of friends predicted whether an individual was one of the 140 escaped."

See table below for the final three verifications:

The only in-text claim that we are not able to confirm is their statement that there is no mortality difference between the colored non-officers and the rest of the Andersonville POWs (page 1480, footnote 29) as we don't have any

	Ta	Table 3.18: Weibul	Veibul			
	Specification	1	Specification 2	2	Specification 3	3
VARIABLES	Hazard rate	Std. err.	Hazard rate	Std. err.	Hazard rate	Std. err.
Number of friends	0.986	-0.009	0.979	-0.009		
Initial number of friends					0.977++	-0.009
Ln(number of prisoners in camp)			1.531++	-0.139	1.517++	-0.139
Fraction of company dying before capture	1.242	-0.897	1.008	-0.722	0.733	-0.525
Professional or propietor	0.566	-0.147	0.562	-0.144	0.554	-0.142
Artisan	0.95	-0.121	0.952	-0.12	0.942	-0.119
Laborer	1.308	-0.157	1.303	-0.154	1.296	-0.154
German	1.198	-0.218	1.169	-0.212	1.153	-0.209
Irish	0.771	-0.123	0.765*	-0.12	0.753*	-0.118
British	0.630*	-0.17	0.644	-0.174	0.646	-0.176
Other	0.656*	-0.155	0.643*	-0.153	0.640*	-0.151
Sargeant, corporal or officer	0.536++	-0.114	0.531++	-0.11	0.528++	-0.11
Age at captivity	1.046++	-0.008	1.045++	-0.008	1.045++	-0.008
Height at entlistment	1.01	-0.007	1.01	-0.007	1.011	-0.007
Observations	23256		23256		23256	
Log pseudo likelihood	-1322.852		-1306.836		-1305.627	
Duration dependence	1.088		1.08		1.084	

a. Company clustered standard errors are in parentheses. Symbols ++, +, and \* indicate statistical significance levels of 1, 5, and 10 percent respectively.

	Table 3.19: co.	ntrolling for	Table 3.19: controlling for months survived	/ed		
	Specification	1	Specification	2	Specification	3
	Hazard rate	Std. err.	Hazard rate	Std. err.	Hazard rate	Std. err.
Number of friends	0.989	-0.009	0.982*	-0.009		
Initial number of friends					0.977++	-0.009
Ln(number of prisoners in camp)			1.612++	-0.146	1.604++	-0.145
Fraction of company dying before capture	re 1.368	-1.001	1.117	-0.811	0.832	-0.603
Professional or propietor		-0.145	0.557	-0.142	0.547	-0.14
Artisan	0.946	-0.121	0.951	-0.121	0.939	-0.12
Laborer	1.302	-0.158	1.302	-0.156	1.298	-0.156
German	1.22	-0.223	1.195	-0.216	1.178	-0.213
a Irish	0.774	-0.125	0.770*	-0.122	0.756*	-0.12
British	0.618*	-0.168	0.632*	-0.172	$0.634^{*}$	-0.174
Other	0.658*	-0.156	0.650*	-0.156	0.647*	-0.154
Sargeant, corporal or officer	0.533++	-0.114	0.531++	-0.111	0.526++	-0.11
Age at captivity	1.047++	-0.008	1.046++	-0.008	1.045++	-0.008
Height at entlistment	1.01	-0.007	1.01	-0.007	1.011	-0.007
Survived 1 month	0.407++	-0.08	0.362++	-0.072	0.352++	-0.071
Survived 2 months	0.472++	-0.092	0.401++	-0.08	0.393++	-0.078
Survived 3 months	0.74	-0.137	0.64	-0.12	0.631	-0.118
Survived 4 or more months	0.833	-0.134	0.745*	-0.12	0.740*	-0.119
Observations	23256		23256		23256	
Log pseudo likelihood	-1307.333		-1287.9		-1285.595	

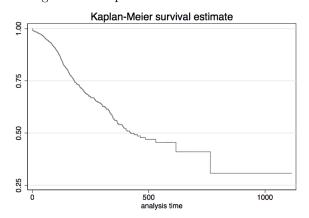
a. Company clustered standard errors are in parentheses. Symbols ++, +, and \* indicate statistical significance levels of 1, 5, and 10 percent respectively.

	J. J. J					
	Hazard rate	Std. err.	Hazard rate	Std. err.	Hazard rate	Std. err.
Number of friends	0.992	-0.009	0.987	-0.009		
Initial number of friends					0.978	-0.009
Ln(number of prisoners in camp)			1.593++	-0.149	1.587++	-0.149
Fraction of company dying before capture	1.751	-1.298	1.558	-1.148	1.179	-0.867
Professional or propietor	0.557	-0.144	0.556	-0.142	0.546	-0.139
Artisan	0.942	-0.121	0.952	-0.122	0.938	-0.12
Laborer	1.284	-0.157	1.287	-0.157	1.284	-0.156
a German	1.241	-0.228	1.218	-0.223	1.2	-0.22
Irish	0.765	-0.126	0.763*	-0.123	0.746*	-0.121
British	0.613*	-0.166	0.625*	-0.169	0.626*	-0.171
Other	0.658*	-0.159	0.652*	-0.159	0.649*	-0.158
Sargeant, corporal or officer	0.538++	-0.115	0.537++	-0.113	0.532++	-0.112
Age at captivity	1.048++	-0.008	1.046++	-0.008	1.046++	-0.008
Height at entlistment	1.01	-0.008	1.01	-0.007	1.011	-0.007
Observations	23256		23256		23256	
Log pseudo likelihood	-3102.845		-3086.134		-3083.63	

a. Company clustered standard errors are in parentheses. Symbols ++, +, and \* indicate statistical significance levels of 1, 5, and 10 percent respectively.

	Table 3.21: table	le 4 net transfer	
	VARIABLES	Hazard Rate	Std. err.
2	Net transfer of friends	0.946**	-0.024
	Observations	15998	

Figure 3.2: Kaplan-Meier survival estimate



information on the race of the POWs.

#### Appendix: Non-parametric estimation

The following figures are our replications of the Kaplan-Meier survival estimates which show no differences to the original:

Tab	Table 3.22: Final three specifications	ions	
	Dependent variable: Lived		Dependent variable: Lived Dependent variable: Escaped
	Shorter time period	Privates only	
Number of men in company	0.003++	0.003++	0
	-0.001	-0.001	0
Fraction of company with rank sergeant or higher	0.115	0.139++	-0.001
		-0.036	-0.002
Number of men with same last name in regiment	0.033++	0.035++	0
	-0.007	-0.007	0
Log(number of men in camp from same town)	-0.003	-0.001	0
	-0.005	-0.005	0
Pseudo R2	0.036	0.047	0.015
Observations	25880	27923	28190

a. Company clustered standard errors are in parentheses. Symbols ++, +, and \* indicate statistical significance levels of 1, 5, and 10 percent respectively.

a

Figure 3.3: Kaplan-Meier survival estimates by early and late capture date

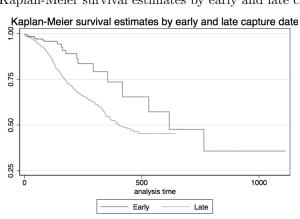


Figure 3.4: Kaplan-Meier survival estimates by camp for late captures

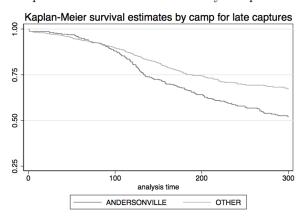
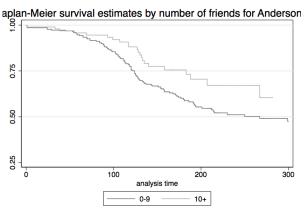


Figure 3.5: Kaplan-Meier survival estimates by number of friends for Anderson



Costa, Dora L., and Matthew E Kahn. 2007. "Surviving Andersonville: The benefits of social networks in POW camps." *The American Economic Review* 97 (4): 1467-1487. http://www.aeaweb.org/articles.php?doi=10.1257/aer.97.4.1467\x{fffd}\x{fffd}\x{fffd}.

#### Chapter 4

# Risk and Uncertainty in Unique Equilibria in Currency Attacks

Morris and Shin (1998) finds that the introduction of a risk factor leads to a unique equilibrium coming to be in their model of currency attacks.

In my understanding of the model, the fact that a unique equilibrium only comes to be with the introduction of a risk factor, is the result of the fact that this risk factor eliminates the previously existing uncertainty. In other words, the unique equilibrium is not a surprising result, since Knightian uncertainty is exchanged for quantifiable risk, which is a much fuller set of information. This view is enforced by the fact that the equilibrium is most pronounced when the risk factor (epsilon) is minimised (i.e. set equal to zero), as the authors state themselves. Furthermore, I have doubts about the authors claim that the domain which is solved by the equilibrium is in fact the entire 'ripe for attack' domain.

Morris, Stephen, and Hyun Song Shin. 1998. "Unique equilibrium in a model of self-fulfilling currency attacks." *American Economic Review:*587–597. http://www.jstor.org/stable/116850.

Taleb, Nassim Nicholas. 2010. The black swan: the impact of the highly improbable fragility. Random House Digital, Inc.

### Chapter 5

## Bitcoin and Remitances: The Potential of 'Stupid Phones'

In the 2009 whitepaper (Nakamoto 2009) called "Bitcoin: a peer-to-peer electronic cash system" an anonymous individual or collective referred to a Satoshi Nakamoto (the Japanese equivalent of John Smith) describes an online currency called Bitcoin (BTC). This currency -the first of a group called cryptocurrencies-has the following economics features:

- public transactions
- anonymous addresses
- fixed amount of units
- high granularity (1 Bitcoin = 100,000,000 Satoshi)
- no or low transaction costs

An addition to these economic features, the key feature of Bitcoin is decentralisation. All transactions are kept in a public ledger called the blockchain. An incentive in the form of transaction fees is provided to stimulate the creation of multiple copies of this ledger. Conflict resolution, in this system, is done through majority consensus of blockchain copy holders.

There are a number of features which make Bitcoin attractive for remittances. Firstly, the low transaction costs are a huge step up from the current facilitators, which charge high percentages. Secondly, government intervention (especially in the recipient country) is prevented by the anonymity. Thirdly, recipients can choose to keep their remittance in a currency which is not controlled by their government. Fourthly, the granularity ensures very small transactions can be conducted.

Bitcoin initially because popular in advanced economies such as those in Europe and North America. However, since mid 2013 there has been a large shift towards developing economies, in which comparative advantages of Bitcoin are more pronounced. For example, since its inception, Mt.Gox (located in

Japan) was the largest Bitcoin exchange (marketplace), however in October 2013, Mt.Gox was overtaken by a Chinese exchange.

Bitcoin transactions are conducted by the electronic 'signing' of a transaction. This is a very simple electronic process. Currently many smartphone apps are available to this purpose. However, in the targeted developing economies, many phones are not smartphones, the vast majority using Nokia Operating System (Nokia OS). These phone can also run applications, using the Java Mobile App platform. Currently there are no Bitcoin apps available for this platform.

I propose to participate in the development of open-source applications which would enable the users of stupid phones. We can then exploit the temporal difference when releasing the applications in different languages at different times, as well the downloads from traceable IP addresses.

Nakamoto, Satoshi. 2009. "Bitcoin: A Peer-to-Peer Electronic Cash System." http://bitcoin.org/bitcoin.pdf.

### Chapter 6

### End notes

In the previous chapters I have presented my current research projects. These projects are in various stages of completions.

I believe that my South Africa paper provides an interesting opportunity to exploit the data from the household survey done before and after a highly relevant policy change. Especially since the methodology and location are the same as in Duflo (2000, 2003) In addition to this there is now a third data wave which has become available. This provides us with more data, and mostly the opportunity to use more interesting methodology. The text of the paper still has to be written.

The replication of Surviving Andersonville is already completed in term of the replication in Stata. We would like to redo the analysis in R (R Core Team 2013). The relevance of this for replications can be seen from the recent replication Bell and Miller (2013) of the original Rauchhaus (2009) paper. The findings of this replication can summarised as:

"We were easily able to replicate Rauchhaus key findings in Stata, but couldn't get it to work in R. It took us a long while to work out why, but the reason turned out to be an error in Stata: Stata was finding a solution when it shouldnt'have (because of separation in the data). This solution, as we show in the paper, was wrong and led Rauchhaus paper to overestimate the effect of nuclear weapons on conflict by a factor of several million." (Bell and Miller 2013)

We do not expect to find anything similar to Bell and Miller, but think that it can nevertheless be interesting to replicate findings using a different software package. In R, we can replicate this using the package called 'survival', which supports the Kaplan Meier and NPMLE methods. In addition to this, the paper needs to be rewritten to emphasise the key finding of our replication.

The discussion of Morris and Shin (1998) is in a very early stage. I have looked at the paper in detail, I have also done a brief analysis of my main critique, namely the conflation of risk (quantifiable) and Knightian uncertainy (unquantifiable). However, I would like to present worked out example which demonstrates how this convolution leads to the main result of the paper. In addition to this, this example should demonstrate how the entire 'ripe for attack' region is not solved for the unique equilibrium.

Finally, relating to Bitcoin (Nakamoto 2009), I think that there is a enormous potention for uncontrolled low-cost remintances using Bitcoin. I would like to analyse the spread of this. I propose to follow the spread of applications for platforms which are popular in developing economies.

At this point, three out of four of the previously discussed research projects are some form of a replication of prior work. As replications they are mostly critiques of others' work, rather than constructive ideas. This is mostly a result of the fact that these projects progress faster. For this reason, these research projects have progressed more than the projects which are primarily based on my own ideas. However, it is my attention to shift the focus of my thesis to include more original work. Here I present two more ideas which are too preliminary to include in the main body of the text, but are based on my own work.

Firstly, I was in charge of setting up a baseline diagnostic into security perceptions in Conakry, Guinea. This diagnostic will be used to analyse the impact of a police reform conducted here. The reform constitutes of the implementation of a model of 'police de proximitee'. The baseline consist of 4500 interviews using smartphones in the comune of Conkary as well a large number of interviews in N'Zerekore (east Guinea). Some time after the implementation of the police reform as follow up study will be conducted. I propose to conduct an impact evaluation using the results from the studies in which I have taken and will take part.

Secondly, I have previously studied philosophy of science in my bachelors in Theoretical Philosophy. I would like to write one paper about an issue relating to this. In particular I would like to at the effect of outliers. The effect how these outliers has extensively been discussed in contexts such as finance and international economics (Taleb 2010; Sornette 2009), as well as individual behaviour (Kahneman 2011). I would like to see how these principles affect research in development microeconomics.

In this document I have tried to give a description of my research projects. None of these projects are near completion and many are in fact in a very early stage. The purpose of this has been to describe the direction I am taking with my thesis, and to receive feedback on this. As a result of this being work in progress, the articles are still incomplete, this includes lacking the proper attribution of ideas using citations.

- Bell, Mark, and Nicholas Miller. 2013. "Questioning the Effect of Nuclear Weapons on Conflict." Forthcoming, Journal of Conflict Resolution.
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