

Supplementary Material 1: Code to Reproduce Analysis and Plots

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Introduction

The aim of this document is to display the R code needed to reproduce the findings of the main text. This document needs the **twinR** package to be installed to run.

```
#cleanup memory
gcstuff <- gc(verbose=FALSE); rm(gcstuff);
```

```
#get last birth adding function
source("./R/last_birth.R")
```

```
#simplified twinR summary tables
source("./R/twinR_summary.R")
```

```
#fix twinR compute predictions to do prediction with no lambda as well
source("./R/twinR_predictions.R")
```

```
#simple convenience functions
source("./R/utils.R")
```

```
## Identify number of CPU cores available for parallel computing,
## note: using a large number may lead RAM to max out, so you may have to adjust
## that according to your infrastructure:
nb_cores <- min(c(50L, parallel::detectCores() - 1))
```

```
## Set option in spaMM:
spaMM::spaMM.options(nb_cores = nb_cores)
```

```
## Registered S3 methods overwritten by 'registry':
##   method                from
##   print.registry_field proxy
##   print.registry_entry proxy
```

Data Import Estonia

The Estonian dataset has been formatted to include the same columns as *the data_births_all* dataset from the **twinR** package. The only difference is that the columns *pop* and *monthly* are excluded as these are constant.

```

#Import and preprocess Estonian Data

data_births_monthly_EE <- readRDS("./data/data_births_all_EE.rds")

#the twinR package expects population to be present
data_births_monthly_EE$pop <- "Estonia"

## Expand the birth level data for the fit of statistical models:
data_births_monthly_EE <- twinR::expand_data(data_births_monthly_EE)

data_births_monthly_EE <- add_last_birth(data_births_monthly_EE)

data_births_monthly_EE_not_last <- data_births_monthly_EE[!data_births_monthly_EE$last,]

#make the aggregates
dmm_EE <- twinR::aggregate_data(data_births_monthly_EE)
dmm_EE$prob_twin <- dmm_EE$twin_total / dmm_EE$births_total

dmm_EE_nl <- twinR::aggregate_data(data_births_monthly_EE_not_last)
dmm_EE_nl$prob_twin <- dmm_EE_nl$twin_total / dmm_EE_nl$births_total

```

Data Import 9 Other European Populations

```

##Import and pre-process twinR package data

## Filter the raw data to only keep data with monthly resolution:
data_births_monthly <- twinR::filter_data(twinR::data_births_all)

## Expand the birth level data for the fit of statistical models:
data_births_monthly <- twinR::expand_data(data_births_monthly)

data_births_monthly <- add_last_birth(data_births_monthly)
data_births_monthly_not_last <- data_births_monthly[!data_births_monthly$last,]

dmm_orig <- twinR::aggregate_data(data_births_monthly)
dmm_orig$prob_twin <- dmm_orig$twin_total / dmm_orig$births_total

dmm_orig_nl <- twinR::aggregate_data(data_births_monthly_not_last)
dmm_orig_nl$prob_twin <- dmm_orig_nl$twin_total / dmm_orig_nl$births_total

#compared to twinR original add data on :
#-age at first birth (AFB)
#-quantiles range mother birth year
#-quantiles range offspring birth year
#-mean + SE total births
all_tbls <- rbind(build_data_summary.table(data_births_monthly),
                  build_data_summary.table(data_births_monthly_not_last),
                  build_data_summary.table(data_births_monthly_EE),
                  build_data_summary.table(data_births_monthly_EE_not_last))

```

```

#some labels
estLab <- "Estonian"
westLab <- "9 other European"

all_tbls$Dataset <- rep(c("All births", "Without last birth"),2)
all_tbls$Populations <- rep(c(westLab, estLab),each=2)
all_tbls <- as.data.frame(all_tbls)
row.names(all_tbls) <- paste0(all_tbls$Populations, " populations ",
                              tolower(all_tbls$Dataset))

knitr::kable(t(all_tbls),
              caption = paste0("Summary data on the Estonian and other ",
                              "European populations for both ",
                              "all births and without last birth for same mothers"))

```

Table 1: Summary data on the Estonian and other European populations for both all births and without last birth for same mothers

| | 9 other European populations all births | 9 other European populations without last birth | Estonian populations all births | Estonian populations without last birth |
|--|---|---|---------------------------------------|---|
| Populations | 9 other European | 9 other European | Estonian | Estonian |
| Dataset | All births | Without last birth | All births | Without last birth |
| Maternal birth period | 1700-1899 | 1700-1899 | 1850-1899 | 1850-1899 |
| 1/4 and 3/4 quantiles for maternal birth period | 1786-1847 | 1785-1847 | 1873-1890 | 1872-1890 |
| Age at first birth (mean-SE) | 24.68-0.013 | 24.36-0.014 | 25.06-0.007 | 24.5-0.0075 |
| Mothers | 21290 | 18520 | 125575 | 98183 |
| Non-twinners | 19656 | 17344 | 119511 | 94386 |
| Twinnings | 1634 | 1176 | 6064 | 3797 |
| Twinning rate (‰) | 76.75 | 63.50 | 48.29 | 38.67 |
| Offspring birth period | 1720-1945 | 1720-1941 | 1868-1948 | 1868-1943 |
| 1/4 and 3/4 quantiles for offspring birth period | 1817-1879 | 1815-1877 | 1903-1921 | 1901-1918 |
| Births | 105833 | 84543 | 417418 | 291843 |
| Singleton births | 104069 | 83276 | 411026 | 287874 |
| Twin births | 1764 | 1267 | 6392 | 3969 |
| Twinning rate (‰) | 16.67 | 14.99 | 15.31 | 13.60 |
| Total births (min-median-max) | 1-7-18 | 1-6-17 | 1-4-16 | 1-4-15 |
| Total births (mean-SE) | 6.71-0.0089 | 6.15-0.0093 | 4.75-0.0039 | 4.36-0.0044 |

Fitting models

```

# import the function to do model fit and predictions
source("./R/fit_models.R")

```

Full Data

```
## Estonia - mother level data
```

```
formula <- "cbind(twin_total, singleton_total) ~ 1 + births_total"
```

```
dmm_EE_fit <- fitPredictions(dmm_EE, formula, predict = T)
```

```
## Warning in fitPredictions(dmm_EE, formula, predict = T): Pre-computed fit returned from file:
```

```
## ./data/predictions/cbind(twin_total, singleton_total)~1+births_totaldmm_EE_fit.rds
```

```
## If you want to re-run this step delete the file or change the saveDir!
```

```
## Warning in get_predictions(predDataFname, fit, dataset, args, save): Pre-computed predictions returned from file:
```

```
## ./data/predictions/cbind(twin_total, singleton_total)~1+births_totaldmm_EEdata_fig.rds
```

```
## If you want to re-run this step delete the file or change the saveDir!
```

```
knitr::kable(build_fit_summary.table(dmm_EE_fit$fit))
```

| Type | Variable | Value | Cond. SE | t-value |
|-----------------|-----------------------------------|----------|----------|---------|
| fixed effects | (Intercept) | -4.15 | 0.0269 | -154 |
| | births_total | -0.00183 | 0.00502 | -0.364 |
| response family | binomial with logit link | | | |
| fit info | number of model parameters | 2 | | |
| | marginal log Likelihood | -24446 | | |
| | marginal AIC | 48896 | | |
| | conditional AIC (cAIC) | | | |
| data info | number of fitted observations (N) | 125575 | | |

```
## Estonia - birth level data
```

```
formula <- "twin ~ 1 + poly(cbind(age, parity), 3) + (1|maternal_id)"
```

```
dbm_EE_fit <- fitPredictions(data_births_monthly_EE, formula, nb_boot = 0)
```

```
## Warning in fitPredictions(data_births_monthly_EE, formula, nb_boot = 0): Pre-computed fit returned from file:
```

```
## ./data/predictions/twin~1+poly(cbind(age,parity),3)+(1_x_maternal_id)data_births_monthly_EE_fit.rds
```

```
## If you want to re-run this step delete the file or change the saveDir!
```

```
## Warning in get_predictions(predDataFname, fit, dataset, args, save): Pre-computed predictions returned from file:
```

```
## ./data/predictions/twin~1+poly(cbind(age,parity),3)+(1_x_maternal_id)data_births_monthly_EEdata_fig.rds
```

```
## If you want to re-run this step delete the file or change the saveDir!
```

```
knitr::kable(build_fit_summary.table(dbm_EE_fit$fit))
```

```
## [one-time computation of covariance matrix, which may be slow]
```

| Type | Variable | Value | Cond. SE | t-value |
|---------------|--------------------------------|-------|----------|---------|
| fixed effects | (Intercept) | -4.23 | 0.0288 | -147 |
| | poly(cbind(age, parity), 3)1.0 | 125 | 23.3 | 5.34 |
| | poly(cbind(age, parity), 3)2.0 | -116 | 14.2 | -8.14 |

| Type | Variable | Value | Cond. SE | t-value |
|-----------------|-----------------------------------|--------|----------|---------|
| | poly(cbind(age, parity), 3)3.0 | -68 | 14.9 | -4.55 |
| | poly(cbind(age, parity), 3)0.1 | 44 | 36 | 1.23 |
| | poly(cbind(age, parity), 3)1.1 | 6071 | 20377 | 0.298 |
| | poly(cbind(age, parity), 3)2.1 | 13476 | 14544 | 0.927 |
| | poly(cbind(age, parity), 3)0.2 | -6.92 | 26.9 | -0.257 |
| | poly(cbind(age, parity), 3)1.2 | -11971 | 14297 | -0.837 |
| | poly(cbind(age, parity), 3)0.3 | -12 | 13 | -0.927 |
| random effects | variance between name | 0.524 | | |
| response family | binomial with logit link | | | |
| fit info | number of model parameters | 11 | | |
| | marginal log Likelihood | -32715 | | |
| | marginal AIC | 65452 | | |
| | conditional AIC (cAIC) | | | |
| data info | number of fitted observations (N) | 417418 | | |

```
## TwinR - mother level data
```

```
formula <- "cbind(twin_total, singleton_total) ~ 1 + births_total + (1|pop)"
```

```
dmm_orig_fit <- fitPredictions(dmm_orig, formula, predict=T)
```

```
## Warning in fitPredictions(dmm_orig, formula, predict = T): Pre-computed fit returned from file:
```

```
## ./data/predictions/cbind(twin_total, singleton_total)~1+births_total+(1_x_pop)dmm_orig_fit.rds
```

```
## If you want to re-run this step delete the file or change the saveDir!
```

```
## Warning in get_predictions(predDataFname, fit, dataset, args, save): Pre-computed predictions returned from file:
```

```
## ./data/predictions/cbind(twin_total, singleton_total)~1+births_total+(1_x_pop)dmm_origdata_fig.rds
```

```
## If you want to re-run this step delete the file or change the saveDir!
```

```
knitr::kable(build_fit_summary.table(dmm_orig_fit$fit))
```

| Type | Variable | Value | Cond. SE | t-value |
|-----------------|-----------------------------------|---------|----------|---------|
| fixed effects | (Intercept) | -3.83 | 0.104 | -37 |
| | births_total | -0.0338 | 0.00864 | -3.92 |
| random effects | variance between name | 0.0556 | | |
| response family | binomial with logit link | | | |
| fit info | number of model parameters | 3 | | |
| | marginal log Likelihood | -5993 | | |
| | marginal AIC | 11992 | | |
| | conditional AIC (cAIC) | | | |
| data info | number of fitted observations (N) | 21290 | | |

```
## TwinR - birth level data
```

```
formula <- "twin ~ 1 + poly(cbind(age, parity), 3) + (1|maternal_id) + (1|pop)"
```

```
dbm_orig_fit <- fitPredictions(data_births_monthly, formula, nb_boot = 0)
```

```
## Warning in fitPredictions(data_births_monthly, formula, nb_boot = 0): Pre-computed fit returned from file:
```

```
## ./data/predictions/twin~1+poly(cbind(age,parity),3)+(1_x_maternal_id)+(1_x_pop)data_births_monthly_fit.rds
```

```
## If you want to re-run this step delete the file or change the saveDir!
```

```
## Warning in get_predictions(predDataFname, fit, dataset, args, save): Pre-computed predictions returned
## ./data/predictions/twin~1+poly(cbind(age,parity),3)+(1_x_maternal_id)+(1_x_pop)data_births_monthlyda
## If you want to re-run this step delete the file or change the saveDir!
```

```
knitr::kable(build_fit_summary.table(dbm_orig_fit$fit))
```

```
## [one-time computation of covariance matrix, which may be slow]
```

| Type | Variable | Value | Cond. SE | t-value |
|-----------------------------|-----------------------------------|--------|----------|---------|
| fixed effects | (Intercept) | -4.1 | 0.113 | -36 |
| | poly(cbind(age, parity), 3)1.0 | 74 | 31 | 2.37 |
| | poly(cbind(age, parity), 3)2.0 | -61 | 17.2 | -3.55 |
| | poly(cbind(age, parity), 3)3.0 | -47 | 16.4 | -2.87 |
| | poly(cbind(age, parity), 3)0.1 | -0.936 | 40 | -0.0233 |
| | poly(cbind(age, parity), 3)1.1 | -4006 | 11890 | -0.337 |
| | poly(cbind(age, parity), 3)2.1 | 7710 | 8669 | 0.889 |
| | poly(cbind(age, parity), 3)0.2 | 19 | 27.3 | 0.694 |
| | poly(cbind(age, parity), 3)1.2 | -4380 | 8121 | -0.539 |
| | poly(cbind(age, parity), 3)0.3 | -18.6 | 14.1 | -1.32 |
| random effects | variance between name | 0.485 | | |
| | variance between name | 0.0571 | | |
| response family fit info | binomial with logit link | | | |
| | number of model parameters | 12 | | |
| | marginal log Likelihood | -8828 | | |
| | marginal AIC | 17681 | | |
| data info | conditional AIC (cAIC) | | | |
| | number of fitted observations (N) | 105833 | | |

No Last Births Data

```
## Estonia
formula <- "cbind(twin_total, singleton_total) ~ 1 + births_total"
dmm_EE_nl_fit <- fitPredictions(dmm_EE_nl, formula, predict = T)
```

```
## Warning in fitPredictions(dmm_EE_nl, formula, predict = T): Pre-computed fit returned from file:
## ./data/predictions/cbind(twin_total,singleton_total)~1+births_totaldmm_EE_nl_fit.rds
## If you want to re-run this step delete the file or change the saveDir!
```

```
## Warning in get_predictions(predDataFname, fit, dataset, args, save): Pre-computed predictions returned
## ./data/predictions/cbind(twin_total,singleton_total)~1+births_totaldmm_EE_nldata_fig.rds
## If you want to re-run this step delete the file or change the saveDir!
```

```
knitr::kable(build_fit_summary.table(dmm_EE_nl_fit$fit))
```

| Type | Variable | Value | Cond. SE | t-value |
|---------------|--------------|--------|----------|---------|
| fixed effects | (Intercept) | -4.36 | 0.0333 | -131 |
| | births_total | 0.0179 | 0.00655 | 2.73 |

| Type | Variable | Value | Cond. SE | t-value |
|-----------------|-----------------------------------|--------|----------|---------|
| response family | binomial with logit link | | | |
| fit info | number of model parameters | 2 | | |
| | marginal log Likelihood | -15893 | | |
| | marginal AIC | 31790 | | |
| | conditional AIC (cAIC) | | | |
| data info | number of fitted observations (N) | 98183 | | |

```
## Estonia - birth level data
```

```
formula <- "twin ~ 1 + poly(cbind(age, parity), 3) + (1|maternal_id)"
dbm_EE_nl_fit <- fitPredictions(data_births_monthly_EE_not_last, formula,
                                predict = T, nb_boot = 0)
```

```
## Warning in fitPredictions(data_births_monthly_EE_not_last, formula, predict = T, : Pre-computed fit :
## ./data/predictions/twin~1+poly(cbind(age,parity),3)+(1_x_maternal_id)data_births_monthly_EE_not_last.
## If you want to re-run this step delete the file or change the saveDir!
```

```
## Warning in get_predictions(predDataFname, fit, dataset, args, save): Pre-computed predictions return
## ./data/predictions/twin~1+poly(cbind(age,parity),3)+(1_x_maternal_id)data_births_monthly_EE_not_last.
## If you want to re-run this step delete the file or change the saveDir!
```

```
knitr::kable(build_fit_summary.table(dbm_EE_nl_fit$fit))
```

```
## [one-time computation of covariance matrix, which may be slow]
```

| Type | Variable | Value | Cond. SE | t-value |
|-----------------|-----------------------------------|--------|----------|---------|
| fixed effects | (Intercept) | -4.31 | 0.0365 | -118 |
| | poly(cbind(age, parity), 3)1.0 | 119 | 22.5 | 5.29 |
| | poly(cbind(age, parity), 3)2.0 | -34 | 14.5 | -2.33 |
| | poly(cbind(age, parity), 3)3.0 | -21.9 | 14 | -1.57 |
| | poly(cbind(age, parity), 3)0.1 | 54 | 38 | 1.44 |
| | poly(cbind(age, parity), 3)1.1 | -11865 | 17926 | -0.662 |
| | poly(cbind(age, parity), 3)2.1 | 9736 | 11628 | 0.837 |
| | poly(cbind(age, parity), 3)0.2 | 19.6 | 29 | 0.671 |
| | poly(cbind(age, parity), 3)1.2 | -11242 | 11738 | -0.958 |
| | poly(cbind(age, parity), 3)0.3 | -3.45 | 12.9 | -0.268 |
| random effects | variance between name | 0.487 | | |
| response family | binomial with logit link | | | |
| fit info | number of model parameters | 11 | | |
| | marginal log Likelihood | -20820 | | |
| | marginal AIC | 41662 | | |
| | conditional AIC (cAIC) | | | |
| data info | number of fitted observations (N) | 291843 | | |

```
## TwinR
```

```
formula <- "cbind(twin_total, singleton_total) ~ 1 + births_total + (1|pop)"
dmm_orig_nl_fit <- fitPredictions(dmm_orig_nl, formula, predict = T)
```

```
## Warning in fitPredictions(dmm_orig_nl, formula, predict = T): Pre-computed fit returned from file:
## ./data/predictions/cbind(twin_total,singleton_total)~1+births_total+(1_x_pop)dmm_orig_nl_fit.rds
## If you want to re-run this step delete the file or change the saveDir!
```

```
## Warning in get_predictions(predDataFname, fit, dataset, args, save): Pre-computed predictions returned
## ./data/predictions/cbind(twin_total,singleton_total)~1+births_total+(1_x_pop)dmm_orig_nldata_fig.rds
## If you want to re-run this step delete the file or change the saveDir!
```

```
knitr::kable(build_fit_summary.table(dmm_orig_nl_fit$fit))
```

| Type | Variable | Value | Cond. SE | t-value |
|-----------------|-----------------------------------|-----------|----------|---------|
| fixed effects | (Intercept) | -4.14 | 0.119 | -35 |
| | births_total | -0.000955 | 0.0108 | -0.0881 |
| random effects | variance between name | 0.0691 | | |
| response family | binomial with logit link | | | |
| fit info | number of model parameters | 3 | | |
| | marginal log Likelihood | -4491 | | |
| | marginal AIC | 8988 | | |
| | conditional AIC (cAIC) | | | |
| data info | number of fitted observations (N) | 18520 | | |

```
## TwinR - birth level data
```

```
formula <- "twin ~ 1 + poly(cbind(age, parity), 3) + (1|maternal_id) + (1|pop)"
dbm_orig_nl_fit <- fitPredictions(data_births_monthly_not_last, formula, nb_boot = 0)
```

```
## Warning in fitPredictions(data_births_monthly_not_last, formula, nb_boot = 0): Pre-computed fit returned
## ./data/predictions/twin~1+poly(cbind(age,parity),3)+(1_x_maternal_id)+(1_x_pop)data_births_monthly_not_last_fig.rds
## If you want to re-run this step delete the file or change the saveDir!
```

```
## Warning in get_predictions(predDataFname, fit, dataset, args, save): Pre-computed predictions returned
## ./data/predictions/twin~1+poly(cbind(age,parity),3)+(1_x_maternal_id)+(1_x_pop)data_births_monthly_not_last_fig.rds
## If you want to re-run this step delete the file or change the saveDir!
```

```
knitr::kable(build_fit_summary.table(dbm_orig_nl_fit$fit))
```

```
## [one-time computation of covariance matrix, which may be slow]
```

| Type | Variable | Value | Cond. SE | t-value |
|---------------|--------------------------------|-------|----------|---------|
| fixed effects | (Intercept) | -4.24 | 0.127 | -33 |
| | poly(cbind(age, parity), 3)1.0 | 86 | 31 | 2.75 |
| | poly(cbind(age, parity), 3)2.0 | -35 | 18 | -1.94 |
| | poly(cbind(age, parity), 3)3.0 | -22.8 | 15.9 | -1.43 |
| | poly(cbind(age, parity), 3)0.1 | -23.1 | 42 | -0.548 |
| | poly(cbind(age, parity), 3)1.1 | 4850 | 11442 | 0.424 |
| | poly(cbind(age, parity), 3)2.1 | 2440 | 7667 | 0.318 |
| | poly(cbind(age, parity), 3)0.2 | 7.32 | 30 | 0.248 |
| | poly(cbind(age, parity), 3)1.2 | 1548 | 7323 | 0.211 |
| | poly(cbind(age, parity), 3)0.3 | -11.9 | 13 | -0.909 |

| Type | Variable | Value | Cond. SE | t-value |
|-----------------------------|-----------------------------------|--------|----------|---------|
| random effects | variance between name | 0.536 | | |
| | variance between name | 0.0678 | | |
| response family fit info | binomial with logit link | | | |
| | number of model parameters | 12 | | |
| | marginal log Likelihood | -6480 | | |
| | marginal AIC | 12985 | | |
| data info | conditional AIC (cAIC) | | | |
| | number of fitted observations (N) | 84543 | | |

Plots

```
library(ggplot2)
#some nice colors
bc <- c("azure4","purple4", "black", "navy", "darkgoldenrod2", "springgreen3", "gray")

#use new base theme that displays also grid lines
source("./R/twinR_theme.R")
```

Fig 1a: Estonian vs TwinR Full Data

```
fig2_EE_plot_data <- dmm_EE_fit$results
fig2_orig_plot_data <- dmm_orig_fit$results
```

```
infoTxt <- "model prediction with 95% CI and data mean SE"

fig2_ext_orig <- ggplot() +
  geom_line(data=fig2_EE_plot_data,
    aes(y = estimate, x=births_total, color=estLab), size = 1) +
  stat_summary(data=dmm_EE[dmm_EE$births_total <17, ],
    aes(x=births_total, y=prob_twin, color=estLab, fill = estLab),
    alpha=1,
    position = position_nudge(x = -0.1),
    fun.data=mean_se) +
  geom_ribbon(data=fig2_EE_plot_data,
    aes(y = estimate, x=births_total, ymin = lwr, ymax = upr,
      color=estLab, fill = estLab),
    alpha = 0.3) +
  geom_line(data=fig2_orig_plot_data,
    aes(y = estimate, x=births_total, color=westLab), size = 1) +
  stat_summary(data=dmm_orig[dmm_orig$births_total <19, ],
    aes(x=births_total, y=prob_twin,
      color=westLab, fill=westLab),
    alpha=1,
    shape = 1,
    position = position_nudge(x = 0.1),
    fun.data=mean_se) +
  geom_ribbon(data=fig2_orig_plot_data,
    aes(y = estimate, x=births_total, ymin = lwr, ymax = upr,
```

```

      fill=westLab),
      alpha = 0.1) +
  ggplot2::scale_x_continuous(breaks = 1:18) +
  ggplot2::scale_y_continuous(breaks = seq(0,0.03, by=0.005)) +
  ggplot2::coord_cartesian() +
  labs(subtitle = paste0("(a) All births, ", infoTxt),
       y="Per-birth twin. prob.",
       x="Maternal total births")
p2 <- fig2_ext_orig + base_theme(larger=8) + scale_color_manual(values=bc) +
  scale_fill_manual(values=bc) + guides(color="none") + labs(fill = "population")
p2

```

Warning: Removed 1 rows containing missing values (geom_segment).

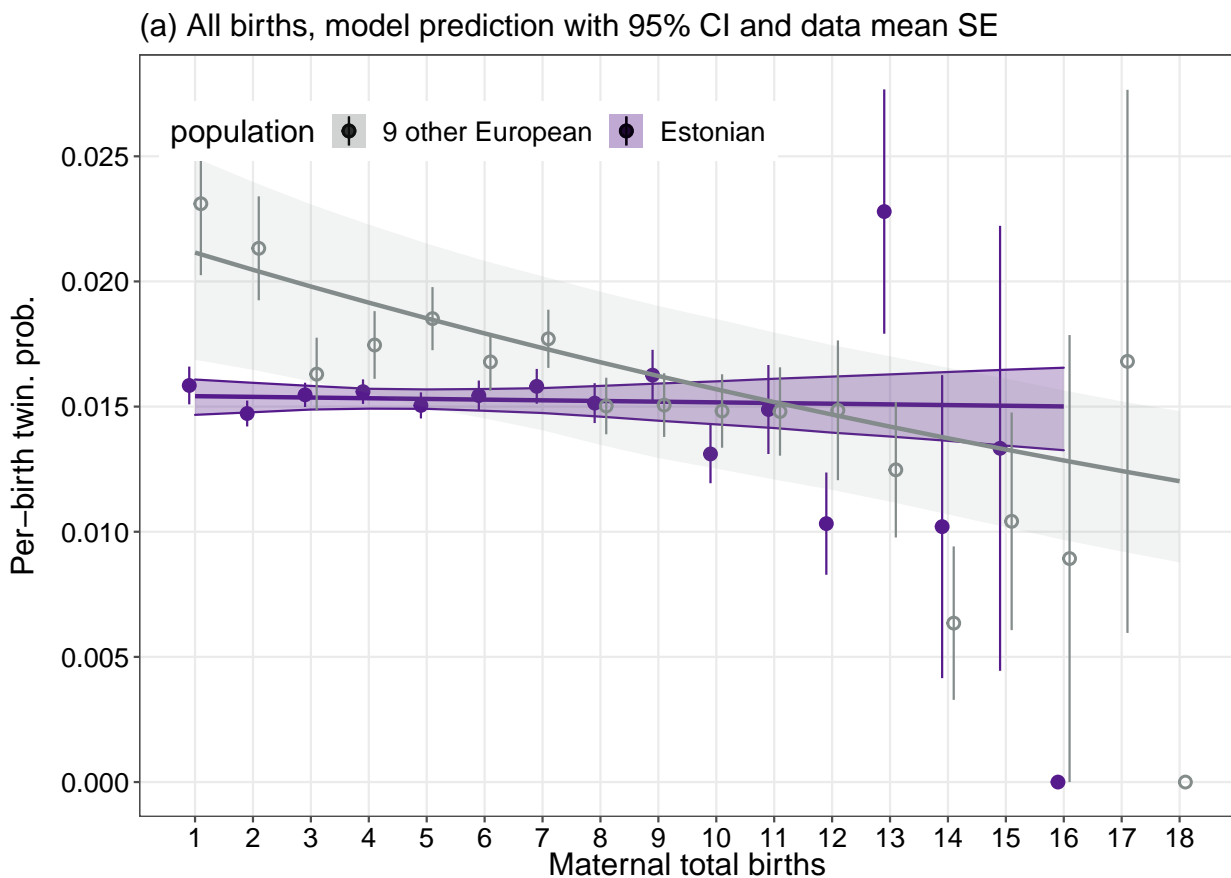


Fig 1b: Estonian vs Others No Last Birth

```

fig2_EE_plot_data_nl <- dmm_EE_nl_fit$results
fig2_EE_plot_data_nl$births_total <- fig2_EE_plot_data_nl$births_total + 1
fig2_orig_plot_data_nl <- dmm_orig_nl_fit$results
fig2_orig_plot_data_nl$births_total <- fig2_orig_plot_data_nl$births_total + 1

```

```

dmm_EE_nl_plot <- dmm_EE_nl
dmm_orig_nl_plot <- dmm_orig_nl
dmm_EE_nl_plot$births_total <- dmm_EE_nl_plot$births_total + 1
dmm_orig_nl_plot$births_total <- dmm_orig_nl_plot$births_total + 1

fig2_ext_orig <- ggplot() +
  geom_line(data=fig2_EE_plot_data_nl,
    aes(y = estimate, x=births_total, color=estLab), size = 1) +
  stat_summary(data=dmm_EE_nl_plot,
    aes(x=births_total, y=prob_twin, color=estLab, fill = estLab),
    alpha=1,
    fun.data=mean_se,
    position = position_nudge(x = -0.1)) +
  geom_ribbon(data=fig2_EE_plot_data_nl,
    aes(y = estimate, x=births_total, ymin = lwr, ymax = upr,
      color=estLab, fill = estLab),
    alpha = 0.3) +
  geom_line(data=fig2_orig_plot_data_nl,
    aes(y = estimate, x=births_total, color=westLab), size = 1) +
  stat_summary(data=dmm_orig_nl_plot,
    aes(x=births_total, y=prob_twin,
      color=westLab, fill=westLab),
    alpha=1,
    shape = 1,
    fun.data=mean_se,
    position = position_nudge(x = 0.1)) +
  geom_ribbon(data=fig2_orig_plot_data_nl,
    aes(y = estimate, x=births_total, ymin = lwr, ymax = upr,
      fill=westLab),
    alpha = 0.1) +
  ggplot2::scale_x_continuous(breaks = 1:18, limits = c(1,NA)) +
  ggplot2::scale_y_continuous(breaks = seq(0,0.03, by=0.005)) +
  ggplot2::coord_cartesian(ylim=c(0,0.03)) +
  labs(subtitle = paste0("(b) Without last birth, ", infoTxt),
    y="Per-birth twin. prob.",
    x="Maternal total births")
p3 <- fig2_ext_orig + base_theme(larger=8) + scale_color_manual(values=bc) +
  scale_fill_manual(values=bc) + guides(color="none") + labs(fill = "population")

p3

```

```
## Warning: Removed 1 rows containing missing values (geom_segment).
```

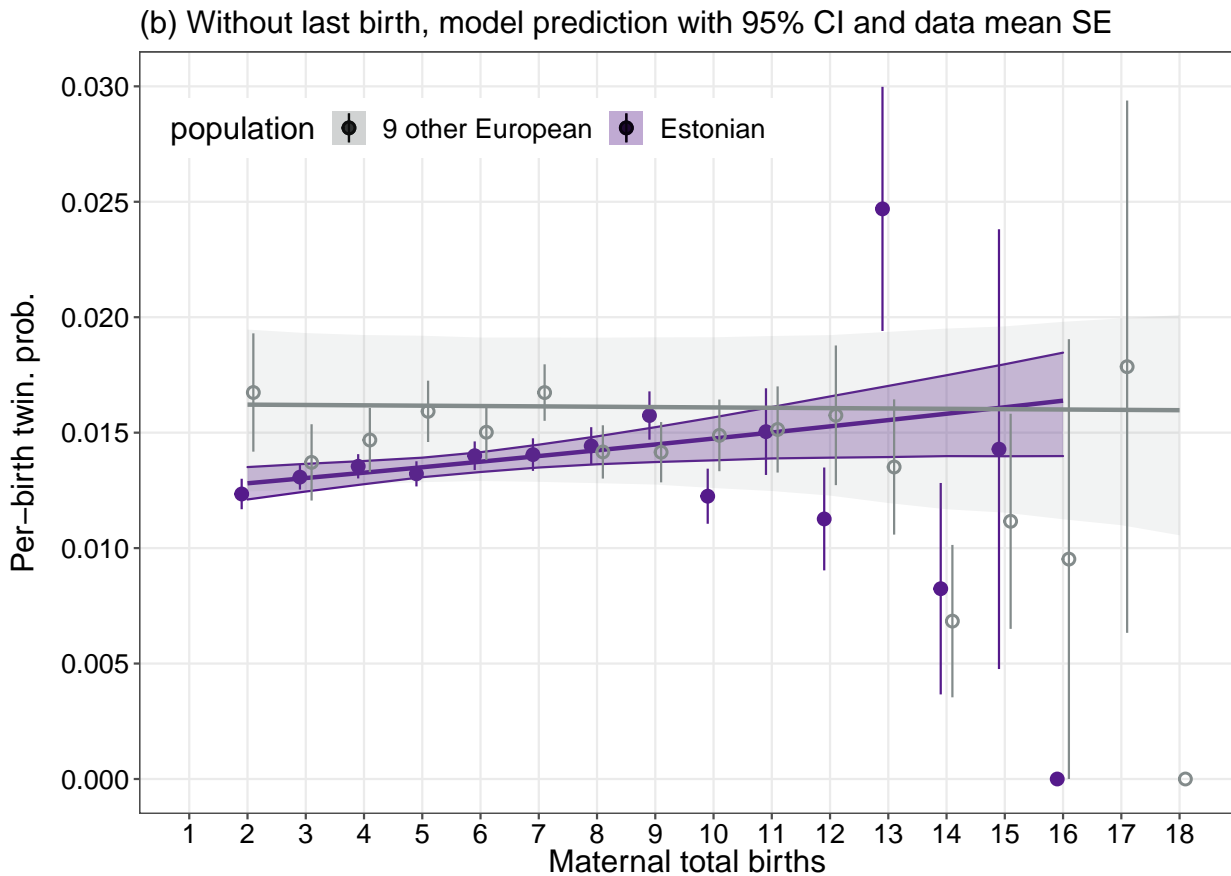


Figure 2: Model Mean Predictions from Birth Level Data

```
#use new draw_fig_4C function
source("../R/twinR_theme.R")
```

```
#extract predictions
fig4C_EE_plot_data <- dbm_EE_fit$results
fig4C_EE_plot_data$twin <- fig4C_EE_plot_data$estimates

fig4C_orig_plot_data <- dbm_orig_fit$results
fig4C_orig_plot_data$twin <- fig4C_orig_plot_data$estimates

fig4C_EE_nl_plot_data <- dbm_EE_nl_fit$results
fig4C_EE_nl_plot_data$twin <- fig4C_EE_nl_plot_data$estimates
fig4C_EE_nl_plot_data$parity <- fig4C_EE_nl_plot_data$parity + 1

fig4C_orig_nl_plot_data <- dbm_orig_nl_fit$results
fig4C_orig_nl_plot_data$twin <- fig4C_orig_nl_plot_data$estimates
fig4C_orig_nl_plot_data$parity <- fig4C_orig_nl_plot_data$parity + 1
```

```
rescale_cd <- scale_y_continuous(limits = c(NA, 0.035))

fig2b <- draw_fig_4C(fig4C_orig_plot_data) +
```

```

  labs(subtitle = paste0("(b) ", westLab, ", all births"))

fig2a <- draw_fig_4C(fig4C_EE_plot_data) +
  labs(subtitle = paste0("(a) ", estLab, ", all births"))

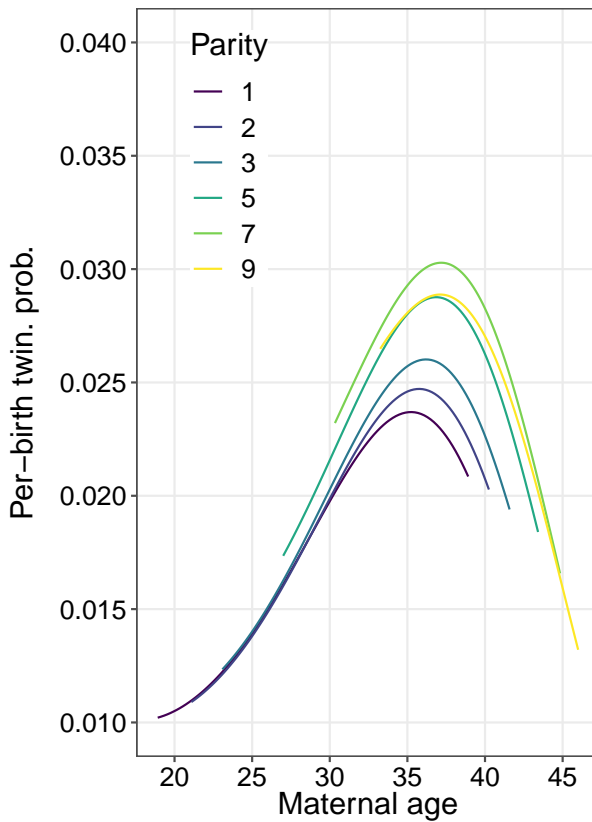
fig2d <- draw_fig_4C(fig4C_orig_nl_plot_data, y_lims = c(0.01, 0.035)) +
  labs(subtitle = paste0("(d) ", westLab, ", w/o last b."))

fig2c <- draw_fig_4C(fig4C_EE_nl_plot_data, y_lims = c(0.01, 0.035)) +
  labs(subtitle = paste0("(c) ", estLab, ", without last birth"))

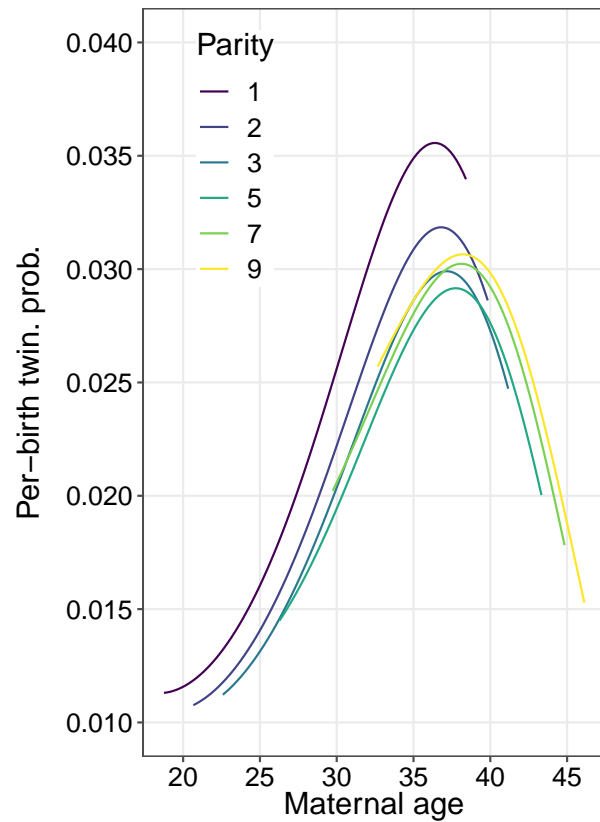
gridExtra::grid.arrange(fig2a + guides(), fig2b, fig2c, fig2d, ncol=2)

```

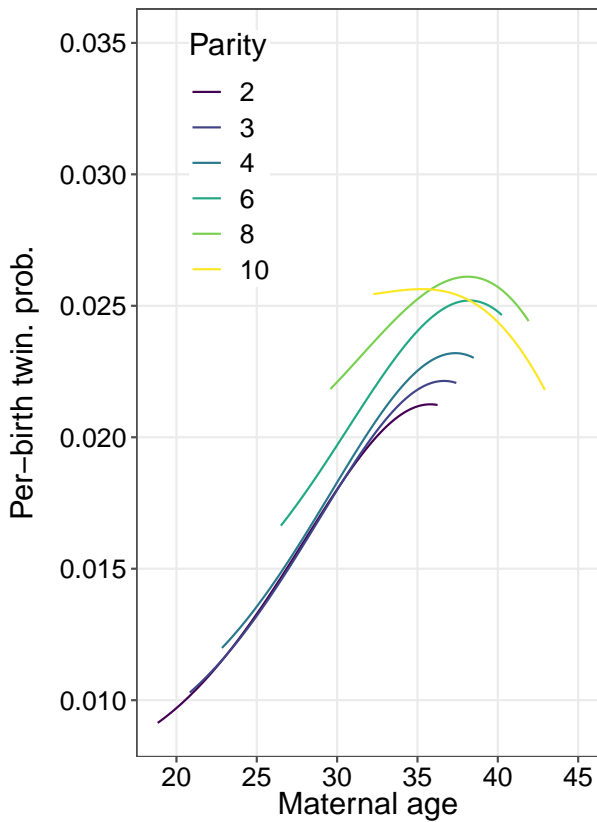
(a) Estonian, all births



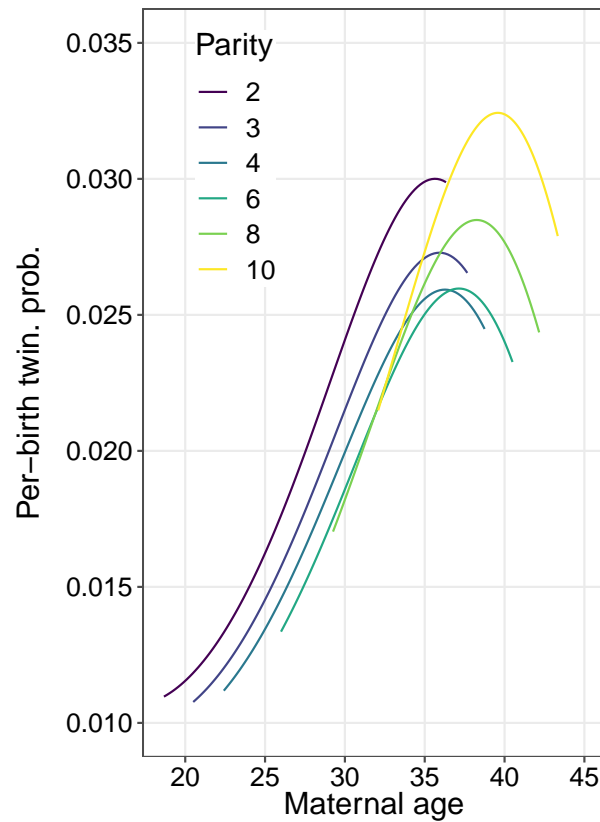
(b) 9 other European, all births



(c) Estonian, without last birth



(d) 9 other European, w/o last b.



#END