Graunt's and Halley's Life Table with ggplot

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Source of Data

Data Input

• Graunt's Life Table

```
rm(list = ls())
graunt <- data.frame(x = c(0, seq(6, 76, by = 10)), lx.17th = c(100, 64, 40, 25, 16, 10, 6, 3, 1))
```

More data

• US 1993 life table for the same age group

```
us.93 \leftarrow data.frame(x = graunt$x, 1x.93 = c(100, 99, 99, 98, 97, 95, 92, 84, 70))
```

Data Extraction There are many ways to extract part of us.93 data frame.

```
us.93["lx.93"]
    1x.93
##
## 1
      100
## 2
       99
## 3
       99
## 4
       98
## 5
       97
## 6
       95
## 7
       92
## 8
       84
## 9
       70
us.93["lx.93"][[1]]
## [1] 100 99 99 98 97 95 92 84 70
us.93["lx.93"]$lx.93
## [1] 100 99 99 98 97 95 92 84 70
us.93["lx.93"]$lx
## [1] 100 99 99 98 97 95 92 84 70
```

```
us.93[2]
##
    1x.93
## 1
      100
## 2
       99
## 3
       99
## 4
       98
## 5
       97
## 6
       95
## 7
       92
## 8
       84
## 9
       70
us.93[2][[1]]
## [1] 100 99 99 98 97 95 92 84 70
us.93[2]$1x.93
## [1] 100 99 99 98 97 95 92 84 70
us.93[, "lx.93"]
## [1] 100 99 99 98 97 95 92 84 70
us.93[, 2]
## [1] 100 99 99 98 97 95 92 84 70
us.93$1x.93
## [1] 100 99 99 98 97 95 92 84 70
us.93$1x
## [1] 100 99 99 98 97 95 92 84 70
Into one single data frame Combine two data frames into one single data frame
(graunt.us <- data.frame(graunt, 1x.93 = us.93$1x))
     x lx.17th lx.93
##
           100
## 1 0
                 100
## 2 6
            64
                  99
## 3 16
            40
                  99
## 4 26
            25
                  98
## 5 36
                  97
            16
## 6 46
            10
                  95
## 7 56
            6
                  92
## 8 66
             3
                  84
## 9 76
                  70
             1
```

Life Expectancy The basic principle is that the area under the survival function is the life expectancy.

$$X \ge 0, \ X \sim F(x) => X \equiv F^{-1}(U), U \sim U(0,1), \ {\rm therefore},$$

$$E(X) = E\{F^{-1}(U)\} = \int_0^1 F^{-1}(u) du = \int_0^\infty 1 - F(x) dx = \int_0^\infty S(x) dx$$

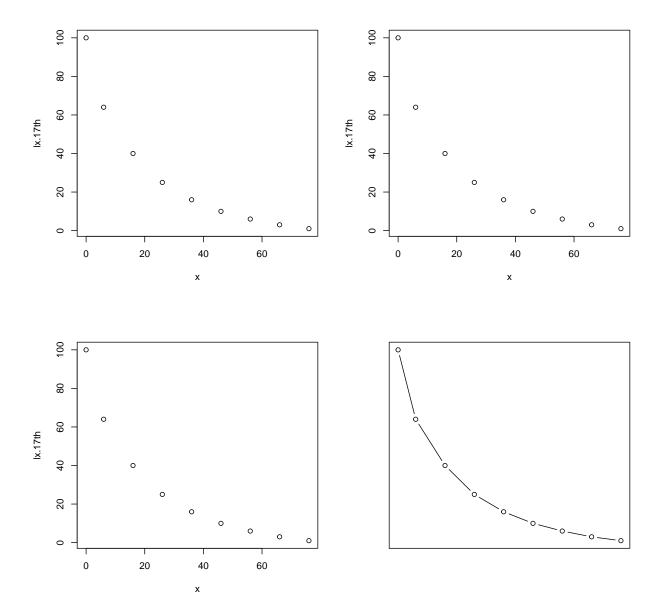
Step by step approach to draw survival curve

1. Basic plot with points and lines, compare the following threes methods

```
library(extrafont)
```

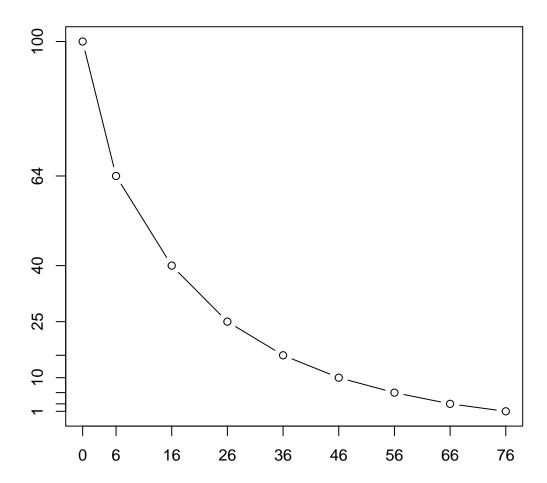
Registering fonts with R

```
par(family = "Helvetica")
par(mfrow = c(2, 2))
plot(graunt)
plot(lx.17th ~ x, data = graunt)
plot(graunt)
plot(graunt, ann = FALSE, xaxt = "n", yaxt = "n", type = "b")
```



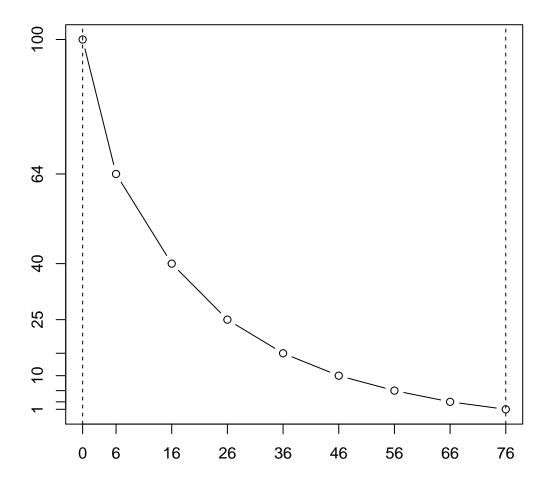
 $2.\,$ Denote the ages and observed survival rates on the axes

```
par(family = "Helvetica")
plot(graunt, ann = FALSE, xaxt = "n", yaxt = "n", type = "b")
axis(side = 1, at = graunt$x, labels = graunt$x)
axis(side = 2, at = graunt$lx.17th, labels = graunt$lx.17th)
```



3. Denote the age 0 and 76 by dotted lines

```
par(family = "Helvetica")
plot(graunt, ann=F, xaxt="n", yaxt="n", type = "b")
axis(side = 1, at=graunt$x, labels=graunt$x)
axis(side = 2, at = graunt$lx.17th, labels = graunt$lx.17th)
abline(v = c(0, 76), lty = 2)
```



```
par(family = "Helvetica")
(graunt.x <- c(graunt$x, 0))</pre>
```

Setting up coordinates for polygon() (Clockwise)

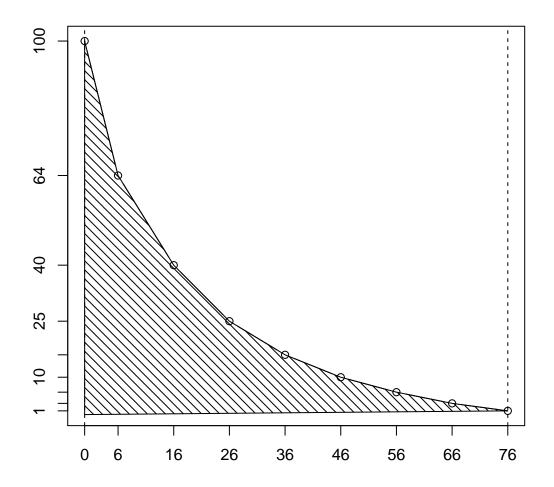
```
## [1] 0 6 16 26 36 46 56 66 76 0
```

```
(graunt.y <- c(graunt$lx.17th, 0))
```

[1] 100 64 40 25 16 10 6 3 1 0

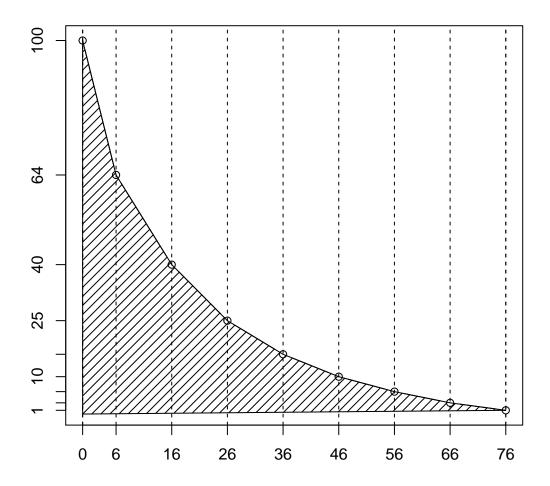
4. Shading

```
par(family = "Helvetica")
plot(graunt, ann = FALSE, xaxt = "n", yaxt = "n", type = "b")
axis(side = 1, at = graunt$x, labels = graunt$x)
axis(side = 2, at = graunt$lx.17th, labels = graunt$lx.17th)
abline(v = c(0, 76), lty = 2)
polygon(graunt.x, graunt.y, density = 15, angle = 135)
```



5. Grids

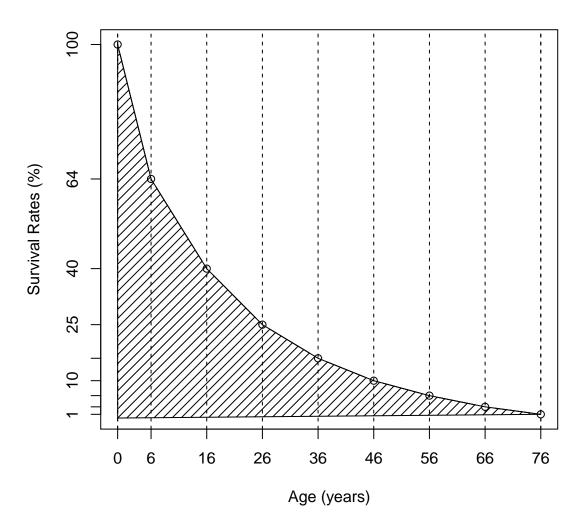
```
par(family = "Helvetica")
plot(graunt, ann = FALSE, xaxt = "n", yaxt = "n", type = "b")
axis(side = 1, at = graunt$x, labels = graunt$x)
axis(side = 2, at = graunt$lx.17th, labels = graunt$lx.17th)
abline(v = c(0, 76), lty = 2)
polygon(graunt.x, graunt.y, density = 15)
abline(v = graunt$x, lty = 2)
```



6. Title, x-axis label, and y-axis label

```
par(family = "Helvetica")
plot(graunt, ann = FALSE, xaxt = "n", yaxt = "n", type = "b")
axis(side = 1, at = graunt$x, labels = graunt$x)
axis(side = 2, at = graunt$lx.17th, labels = graunt$lx.17th)
abline(v = c(0, 76), lty = 2)
polygon(graunt.x, graunt.y, density = 15)
abline(v = graunt$x, lty = 2)
main.title <- "Graunt's Survival Function"
x.lab <- "Age (years)"
y.lab <- "Survival Rates (%)"
title(main = main.title, xlab = x.lab, ylab = y.lab)</pre>
```

Graunt's Survival Function



Area under the curve

- The area under the curve can be approximated by the sum of the areas of trapezoids, therefore the area is

 - $\sum_{i=1}^{n-1} (x_{i+1} x_i) \times \frac{1}{2} (y_i + y_{i+1})$. diff(), head(), and tail() can be used to write a function to compute the area easily.

```
area.R <- function(x, y) {</pre>
 sum(diff(x) * (head(y, -1) + tail(y, -1))/2)
area.R(graunt$x, graunt$lx.17th)/100
```

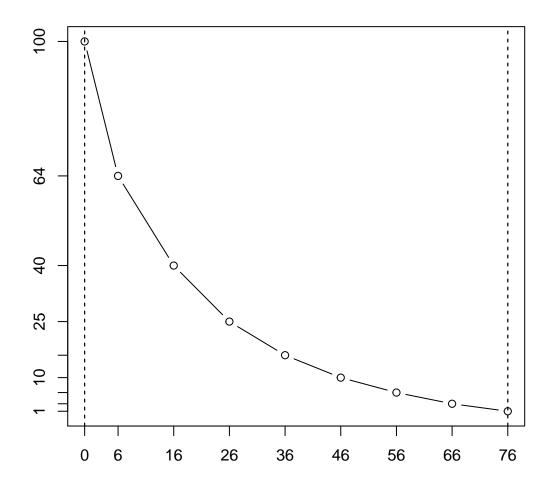
[1] 18.17

Comparison with US 1993 life table

The shaded area between the survival functions of Graunt's and US 1993 represents the difference of life expectancies.

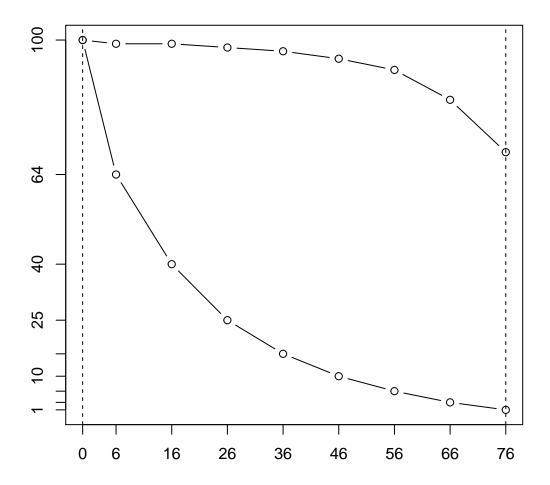
1. Draw Graunt's first with axes, lower and upper limits

```
par(family = "Helvetica")
plot(graunt, ann = FALSE, xaxt = "n", yaxt = "n", type = "b")
axis(side = 1, at = graunt$x, labels = graunt$x)
axis(side = 2, at = graunt$lx, labels = graunt$lx.17th)
abline(v=c(0, 76), lty = 2)
abline(v = c(0, 76), lty = 2)
```



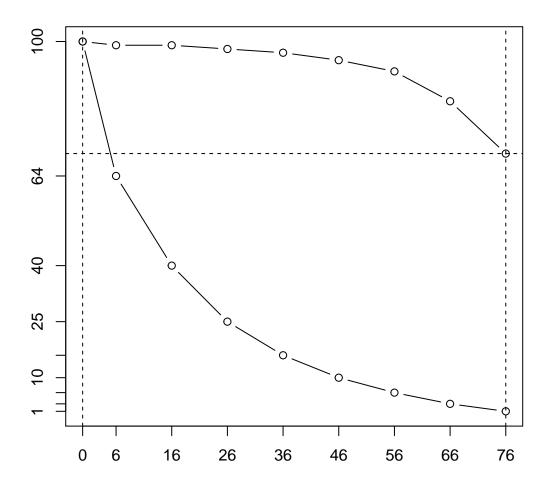
2. Add US 1993 survival function

```
par(family = "Helvetica")
plot(graunt, ann = FALSE, xaxt = "n", yaxt = "n", type = "b")
axis(side = 1, at = graunt$x, labels = graunt$x)
axis(side = 2, at = graunt$lx, labels = graunt$lx.17th)
abline(v = c(0, 76), lty = 2)
lines(us.93$x, us.93$lx.93, type = "b")
```



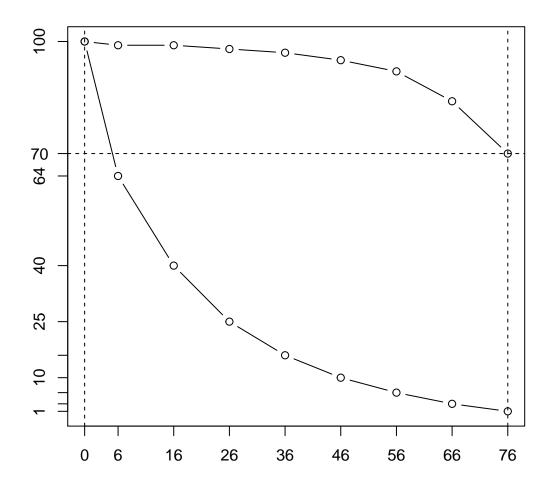
3. Actually, US 1993 life table is truncated at the age 76. Specify that point.

```
par(family = "Helvetica")
plot(graunt, ann = FALSE, xaxt = "n", yaxt = "n", type = "b")
axis(side = 1, at = graunt$x, labels = graunt$x)
axis(side = 2, at = graunt$lx, labels = graunt$lx.17th)
abline(v = c(0, 76), lty = 2)
lines(us.93$x, us.93$lx.93, type = "b")
abline(h = 70, lty = 2)
```



4. Using las = 1 to specify 70%.

```
par(family = "Helvetica")
plot(graunt, ann = FALSE, xaxt = "n", yaxt = "n", type = "b")
axis(side = 1, at = graunt$x, labels = graunt$x)
axis(side = 2, at = graunt$lx, labels = graunt$lx.17th)
abline(v = c(0, 76), lty = 2)
lines(us.93$x, us.93$lx.93, type = "b")
abline(h = 70, lty = 2)
axis(side = 2, at = 70, labels = 70, las = 1)
```



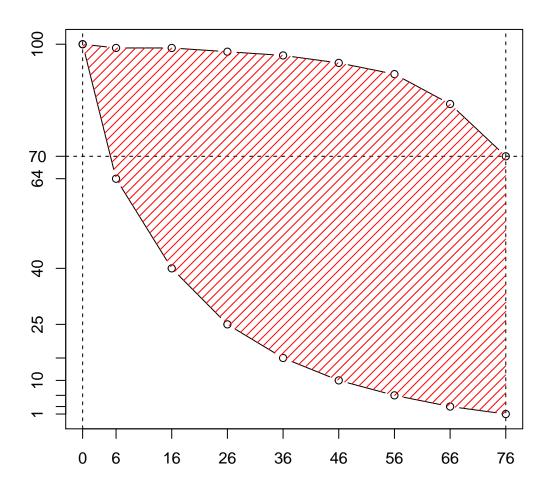
```
us.graunt.x <- c(us.93$x, rev(graunt$x))
us.graunt.y <- c(us.93$lx.93, rev(graunt$lx.17th))</pre>
```

Setting coordinates for polygon()

5. Shading

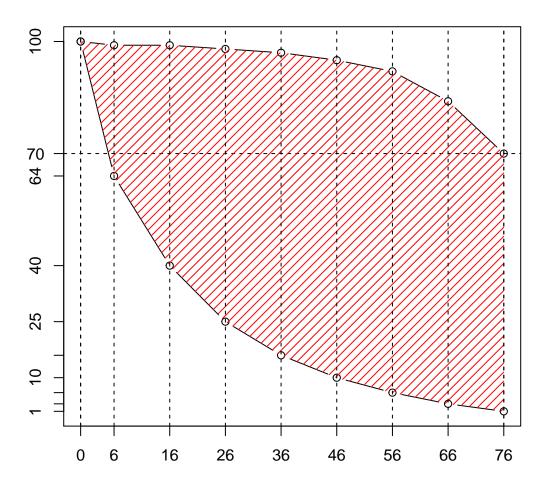
```
par(family = "Helvetica")
plot(graunt, ann = FALSE, xaxt = "n", yaxt = "n", type = "b")
axis(side = 1, at = graunt$x, labels = graunt$x)
axis(side = 2, at = graunt$lx, labels = graunt$lx.17th)
abline(v = c(0, 76), lty = 2)
lines(us.93$x, us.93$lx.93, type = "b")
```

```
abline(h = 70, lty = 2)
axis(side = 2, at = 70, labels = 70, las = 1)
polygon(us.graunt.x, us.graunt.y, density = 15, col = "red", border = NA)
```



6. Grids

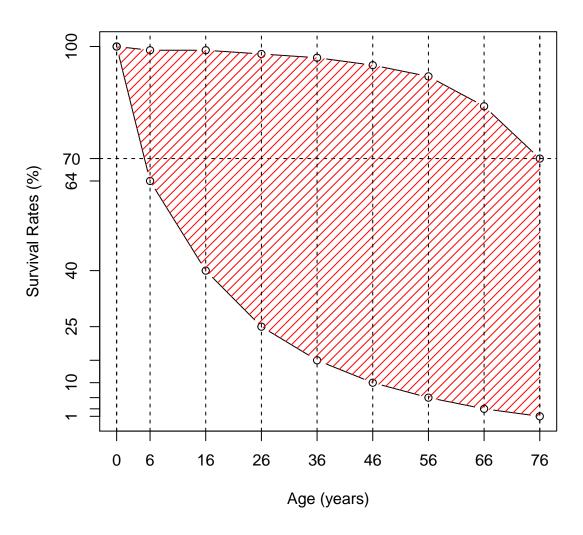
```
par(family = "Helvetica")
plot(graunt, ann = FALSE, xaxt = "n", yaxt = "n", type = "b")
axis(side = 1, at = graunt$x, labels = graunt$x)
axis(side = 2, at = graunt$lx, labels = graunt$lx.17th)
abline(v = c(0, 76), lty = 2)
lines(us.93$x, us.93$lx.93, type = "b")
abline(h = 70, lty = 2)
axis(side = 2, at = 70, labels = 70, las = 1)
polygon(us.graunt.x, us.graunt.y, density = 15, col = "red", border = NA)
abline(v = graunt$x, lty = 2)
```



7. Title, x-axis and y-axis labels

```
par(family = "Helvetica")
plot(graunt, ann = FALSE, xaxt = "n", yaxt = "n", type = "b")
axis(side = 1, at = graunt$x, labels = graunt$x)
axis(side = 2, at = graunt$lx, labels = graunt$lx.17th)
abline(v = c(0, 76), lty = 2)
lines(us.93$x, us.93$lx.93, type = "b")
abline(h = 70, lty = 2)
axis(side = 2, at = 70, labels = 70, las = 1)
polygon(us.graunt.x, us.graunt.y, density = 15, col = "red", border = NA)
abline(v = graunt$x, lty = 2)
main.title.g.us <- "Survival Function of Graunt and US 1993"
title(main = main.title.g.us, xlab = x.lab, ylab = y.lab)</pre>
```

Survival Function of Graunt and US 1993



```
## Warning in dev.copy(device = png, file = "../pics/graunt_us93.png"): font
## family not found in Windows font database

## Warning in dev.copy(device = png, file = "../pics/graunt_us93.png"): font
## family not found in Windows font database

## Warning in dev.copy(device = png, file = "../pics/graunt_us93.png"): font
## family not found in Windows font database

## Warning in dev.copy(device = png, file = "../pics/graunt_us93.png"): font
```

dev.copy(device = png, file = "../pics/graunt_us93.png")

family not found in Windows font database

Warning in dev.copy(device = png, file = "../pics/graunt_us93.png"): font
family not found in Windows font database

```
## Warning in dev.copy(device = png, file = "../pics/graunt_us93.png"): font
## family not found in Windows font database
## Warning in dev.copy(device = png, file = "../pics/graunt_us93.png"): font
## family not found in Windows font database
## Warning in dev.copy(device = png, file = "../pics/graunt_us93.png"): font
## family not found in Windows font database
## Warning in dev.copy(device = png, file = "../pics/graunt_us93.png"): font
## family not found in Windows font database
## Warning in dev.copy(device = png, file = "../pics/graunt_us93.png"): font
## family not found in Windows font database
## Warning in dev.copy(device = png, file = "../pics/graunt_us93.png"): font
## family not found in Windows font database
## Warning in dev.copy(device = png, file = "../pics/graunt_us93.png"): font
## family not found in Windows font database
## Warning in dev.copy(device = png, file = "../pics/graunt_us93.png"): font
## family not found in Windows font database
## Warning in dev.copy(device = png, file = "../pics/graunt_us93.png"): font
## family not found in Windows font database
## Warning in dev.copy(device = png, file = "../pics/graunt_us93.png"): font
## family not found in Windows font database
## Warning in dev.copy(device = png, file = "../pics/graunt_us93.png"): font
## family not found in Windows font database
## png
##
```

Life expectancy The area under the US 1993 survival function is

```
area.R(us.93$x, us.93$lx.93)/100
```

[1] 70.92

The area of shaded region is

```
area.R(us.93$x, us.93$1x.93)/100 - area.R(graunt$x, graunt$1x.17th)/100
```

[1] 52.75

Comparison with Halley's life table

```
age <- 0:84
lx <- c(1238, 1000, 855, 798, 760, 732, 710, 692, 680, 670, 661, 653, 646, 640, 634, 628, 622, 616, 610
length(lx)
```

Halley's life table

```
## [1] 85
```

```
halley <- data.frame(age, lx)
halley$px <- round(halley$lx/1238*100, digits = 1)
head(halley)</pre>
```

```
##
    age
          lx
                рx
## 1
      0 1238 100.0
## 2
      1 1000 80.8
## 3
      2 855 69.1
## 4
      3 798
              64.5
## 5
      4 760 61.4
## 6
      5 732 59.1
```

tail(halley)

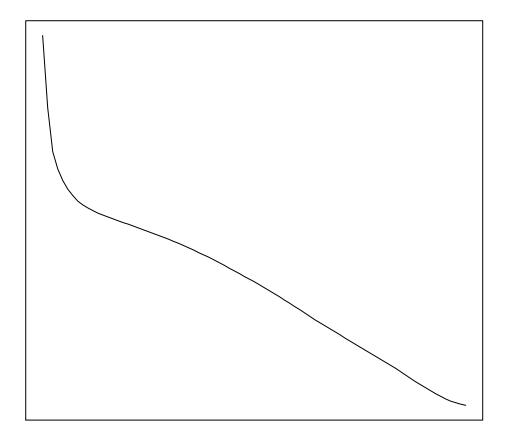
```
## 80 79 50 4.0
## 81 80 41 3.3
## 82 81 34 2.7
## 83 82 28 2.3
## 84 83 23 1.9
## 85 84 20 1.6
```

R base graphics

To make the comparison easy, plot the points at the same age group of Graunt's, 0, 6, 16, 26, 36, 46, 56, 66, 76. Step by step approach

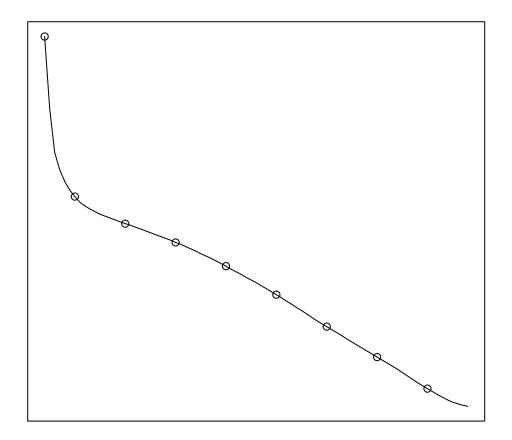
1. Halley's survival function first

```
plot(px ~ age, data = halley, ann = FALSE, xaxt = "n", yaxt = "n", type = "l")
```

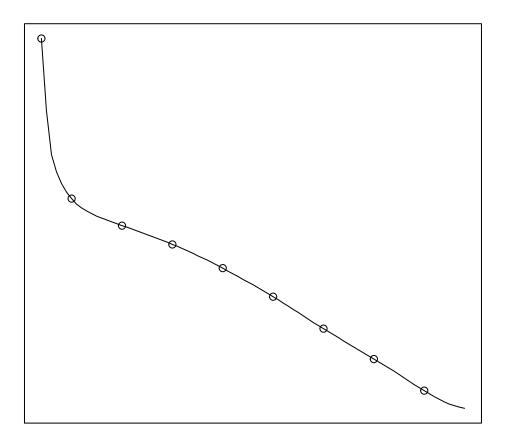


2. Mark the points at 0, 6, 16, 26, 36, 46, 56, 66, 76 on Halley's survival function.

```
age.graunt <- age %in% graunt$x
plot(px ~ age, data = halley, ann = FALSE, xaxt = "n", yaxt = "n", type = "l")
points(px[age.graunt] ~ age[age.graunt], data = halley)</pre>
```



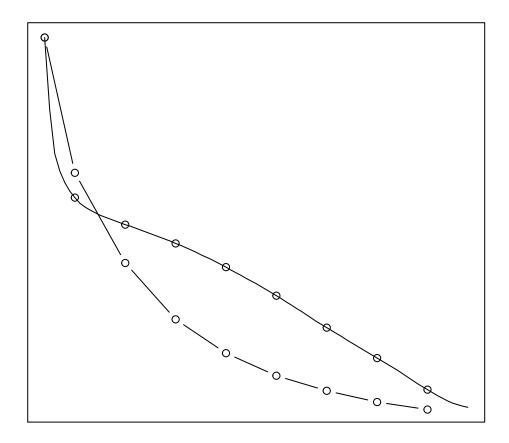
```
halley.graunt <- subset(halley, age.graunt)
plot(px ~ age, data = halley, ann = FALSE, xaxt = "n", yaxt = "n", type = "l")
points(px ~ age, data = halley.graunt)</pre>
```



Using subset()

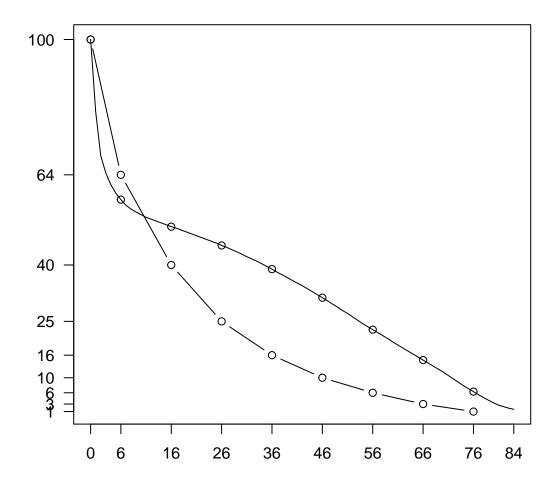
3. Add Graunt's survival function

```
plot(px ~ age, data = halley, ann = FALSE, xaxt = "n", yaxt = "n", type = "l")
points(px ~ age, data = halley.graunt)
lines(lx.17th ~ x, data = graunt, type = "b")
```



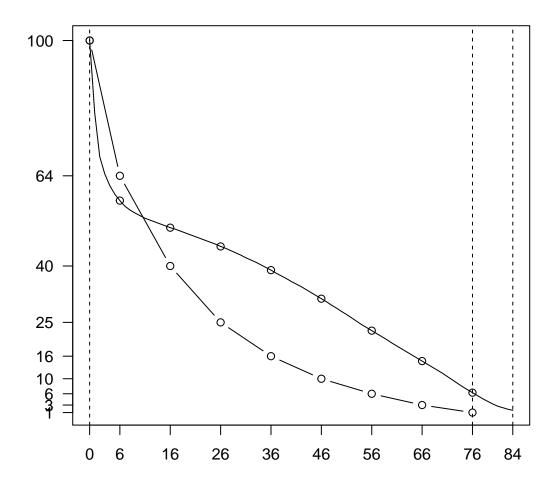
4. x-axis label and y-axis label with las = 1

```
par(family = "Helvetica")
plot(px ~ age, data = halley, ann = FALSE, xaxt = "n", yaxt = "n", type = "l")
points(px ~ age, data = halley.graunt)
lines(lx.17th ~ x, data = graunt, type = "b")
axis(side = 1, at = c(graunt$x, 84), labels = c(graunt$x, 84))
axis(side = 2, at = graunt$lx.17th, labels = graunt$lx.17th, las = 1)
```



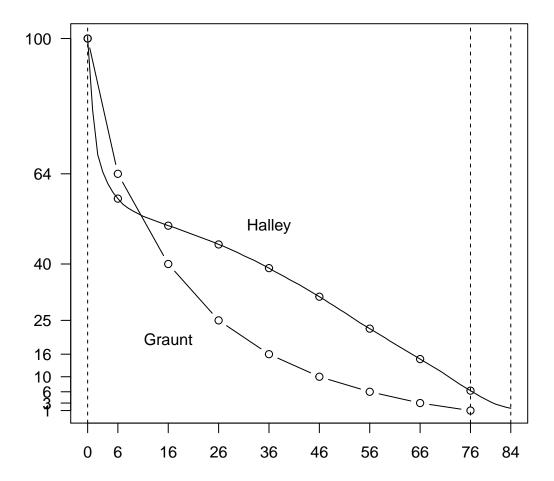
5. Vertical dotted lines at the ages 0, 76, and 84

```
par(family = "Helvetica")
plot(px ~ age, data = halley, ann = FALSE, xaxt = "n", yaxt = "n", type = "l")
points(px ~ age, data = halley.graunt)
lines(lx.17th ~ x, data = graunt, type = "b")
axis(side = 1, at = c(graunt$x, 84), labels = c(graunt$x, 84))
axis(side = 2, at = graunt$lx.17th, labels = graunt$lx.17th, las = 1)
abline(v = c(0, 76, 84), lty = 2)
```



6. Specify the developers at proper coordinates with text()

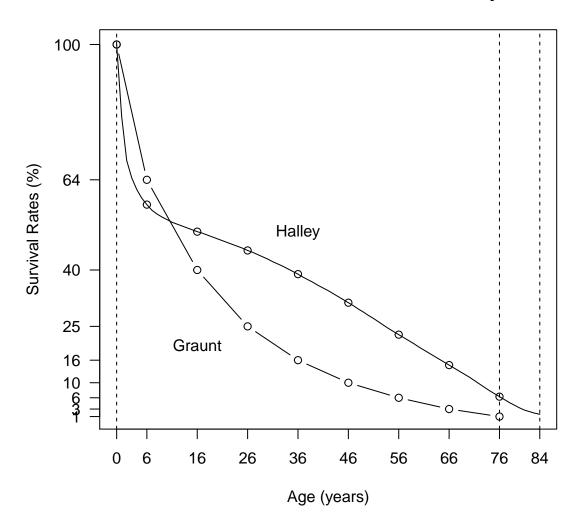
```
par(family = "Helvetica")
plot(px ~ age, data = halley, ann = FALSE, xaxt = "n", yaxt = "n", type = "l")
points(px ~ age, data = halley.graunt)
lines(lx.17th ~ x, data = graunt, type = "b")
axis(side = 1, at = c(graunt$x, 84), labels = c(graunt$x, 84))
axis(side = 2, at = graunt$lx.17th, labels = graunt$lx.17th, las = 1)
abline(v = c(0, 76, 84), lty = 2)
text(x = c(16, 36), y = c(20, 50), label = c("Graunt", "Halley"))
```



7. Main title, x-axis label, and y-axis label

```
par(family = "Helvetica")
plot(px ~ age, data = halley, ann = FALSE, xaxt = "n", yaxt = "n", type = "l")
points(px ~ age, data = halley.graunt)
lines(lx.17th ~ x, data = graunt, type = "b")
axis(side = 1, at = c(graunt$x, 84), labels = c(graunt$x, 84))
axis(side = 2, at = graunt$lx.17th, labels = graunt$lx.17th, las = 1)
abline(v = c(0, 76, 84), lty = 2)
text(x = c(16, 36), y = c(20, 50), label = c("Graunt", "Halley"))
main.title.2 <- "Survival Function of Graunt and Halley"
title(main = main.title.2, xlab = x.lab, ylab = y.lab)</pre>
```

Survival Function of Graunt and Halley



Polygon

Setting the coordinates for polygon(). The intersection is found at x = 10.8, y = 52.8 with locator(1) and couple of trial and errors.

• Upper region

```
poly.1.x <- c(graunt$x[1:2], 10.8, halley$age[11:1])
poly.1.y <- c(graunt$1x.17th[1:2], 52.8, halley$px[11:1])
poly.upper <- data.frame(x = poly.1.x, y = poly.1.y)</pre>
```

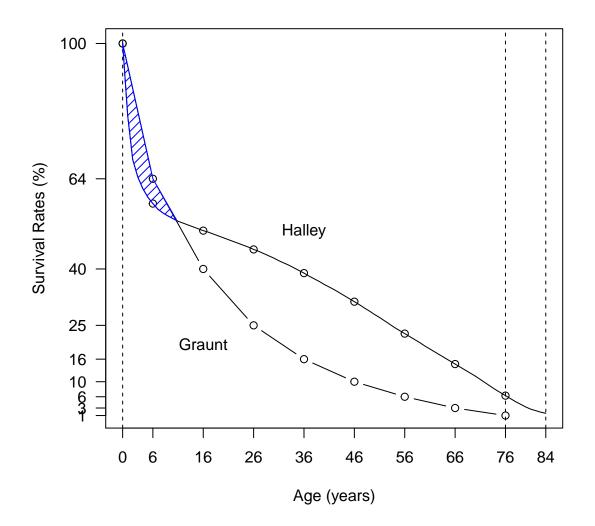
• Lower region

```
poly.2.x <- c(10.8, halley$age[12:85], graunt$x[9:3])
poly.2.y <- c(52.8, halley$px[12:85], graunt$lx.17th[9:3])
poly.lower <- data.frame(x = poly.2.x, y = poly.2.y)</pre>
```

8. Shading upper region first

```
par(family = "Helvetica")
plot(px ~ age, data = halley, ann = FALSE, xaxt = "n", yaxt = "n", type = "l")
points(px ~ age, data = halley.graunt)
lines(lx.17th ~ x, data = graunt, type = "b")
axis(side = 1, at = c(graunt$x, 84), labels = c(graunt$x, 84))
axis(side = 2, at = graunt$lx.17th, labels = graunt$lx.17th, las = 1)
abline(v=c(0, 76, 84), lty = 2)
text(x = c(16, 36), y = c(20, 50), label = c("Graunt", "Halley"))
title(main = main.title.2, xlab = x.lab, ylab = y.lab)
polygon(poly.1.x, poly.1.y, angle = 45, density = 15, col = "blue")
```

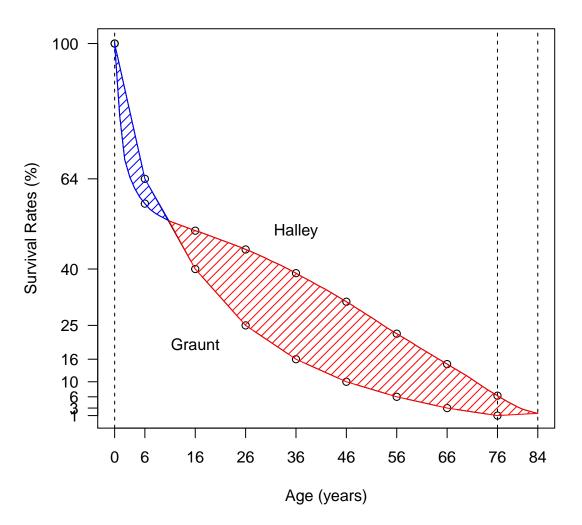
Survival Function of Graunt and Halley



9. Shading lower region next

```
par(family = "Helvetica")
plot(px ~ age, data = halley, ann = FALSE, xaxt = "n", yaxt = "n", type = "l")
points(px ~ age, data = halley.graunt)
lines(lx.17th ~ x, data = graunt, type = "b")
axis(side = 1, at = c(graunt$x, 84), labels = c(graunt$x, 84))
axis(side = 2, at = graunt$lx.17th, labels = graunt$lx.17th, las = 1)
abline(v=c(0, 76, 84), lty = 2)
text(x = c(16, 36), y = c(20, 50), label = c("Graunt", "Halley"))
title(main = main.title.2, xlab = x.lab, ylab = y.lab)
polygon(poly.1.x, poly.1.y, angle = 45, density = 15, col = "blue")
polygon(poly.2.x, poly.2.y, angle = 45, density = 15, col = "red")
```

Survival Function of Graunt and Halley



```
dev.copy(device = png, file = "../pics/graunt_halley.png")
```

Warning in dev.copy(device = png, file = "../pics/graunt_halley.png"): font

```
## family not found in Windows font database
## Warning in dev.copy(device = png, file = "../pics/graunt_halley.png"): font
## family not found in Windows font database
## Warning in dev.copy(device = png, file = "../pics/graunt_halley.png"): font
## family not found in Windows font database
## Warning in dev.copy(device = png, file = "../pics/graunt_halley.png"): font
## family not found in Windows font database
## png
##
Life expectancy Compute the difference of life expectancies
(life.exp.halley <- area.R(halley$age, halley$px)/100)
## [1] 27.872
(life.exp.graunt <- area.R(graunt$x, graunt$lx.17th)/100)
## [1] 18.17
ggplot
library(ggplot2)
Data Reshape
Attach reshape2 package to change wide format to long format
library(reshape2)
How melt() works
graunt.us.melt <- melt(graunt.us, id.vars = "x", measure.vars = c("lx.17th", "lx.93"), value.name = "lx</pre>
graunt.us.melt
##
      x times lx
## 1 0 lx.17th 100
## 2 6 lx.17th 64
## 3 16 lx.17th 40
## 4 26 lx.17th 25
## 5 36 lx.17th 16
## 6 46 lx.17th 10
## 7 56 lx.17th
```

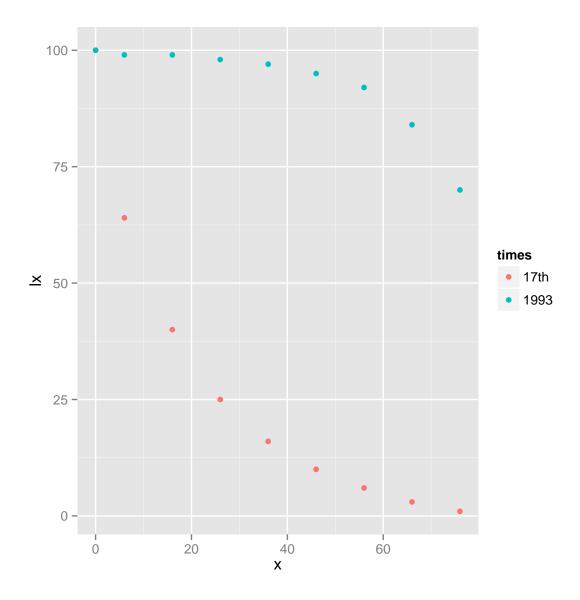
```
## 8 66 lx.17th
## 9 76 lx.17th
                 1
## 10 0
          lx.93 100
         lx.93 99
## 11 6
## 12 16
         lx.93 99
## 13 26 lx.93 98
## 14 36 lx.93 97
## 15 46
         1x.93 95
## 16 56
          1x.93 92
## 17 66
        lx.93 84
## 18 76 lx.93 70
str(graunt.us.melt)
## 'data.frame':
                   18 obs. of 3 variables:
## $ x : num 0 6 16 26 36 46 56 66 76 0 ...
## $ times: Factor w/ 2 levels "lx.17th","lx.93": 1 1 1 1 1 1 1 1 2 ...
## $ lx : num 100 64 40 25 16 10 6 3 1 100 ...
  • Change factor levels of times
levels(graunt.us.melt$times) <- c("17th", "1993")</pre>
str(graunt.us.melt)
                   18 obs. of 3 variables:
## 'data.frame':
## $ x : num 0 6 16 26 36 46 56 66 76 0 ...
## $ times: Factor w/ 2 levels "17th","1993": 1 1 1 1 1 1 1 1 1 2 ...
## $ lx : num 100 64 40 25 16 10 6 3 1 100 ...
  • Fonts for pdf output
theme.pdf <- theme(axis.title.x = element_text(family = "Helvetica"),</pre>
                 axis.title.y = element_text(family = "Helvetica"),
                 axis.text.x = element_text(family = "Helvetica"),
                 axis.text.y = element_text(family = "Helvetica"),
                 plot.title = element text(family = "Helvetica"),
                 legend.title = element text(family = "Helvetica"),
                 legend.text = element_text(family = "Helvetica"))
```

Plot

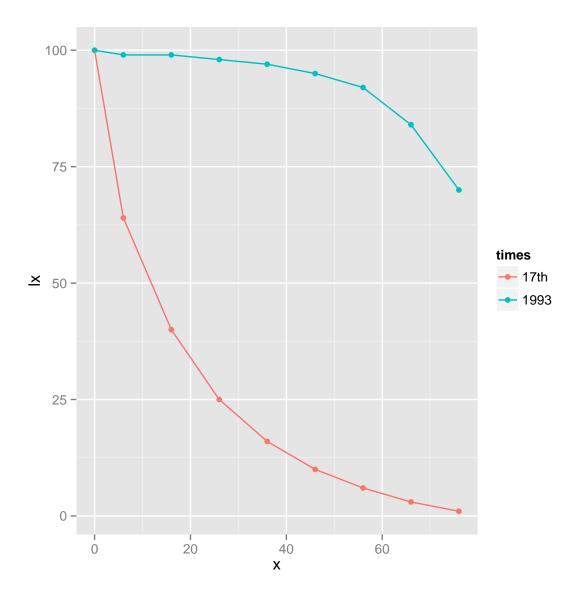
Points and Lines Step by step approach to understand the grammar of ggplot

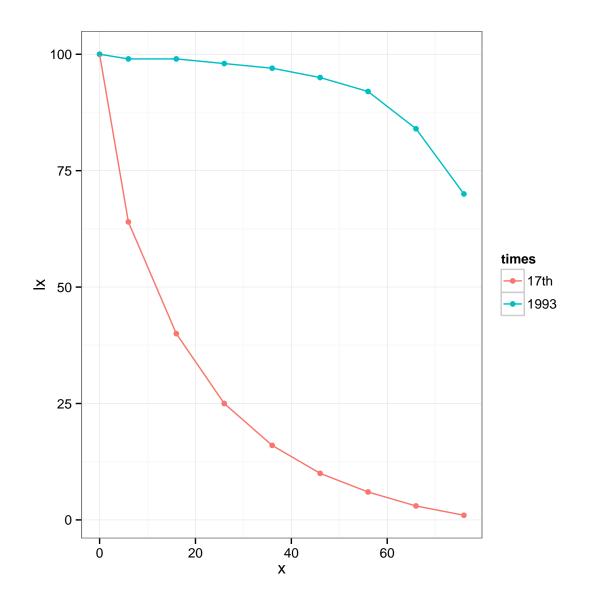
• We set ggplot() to accept varying data.frame() and aes()in geom_polygon

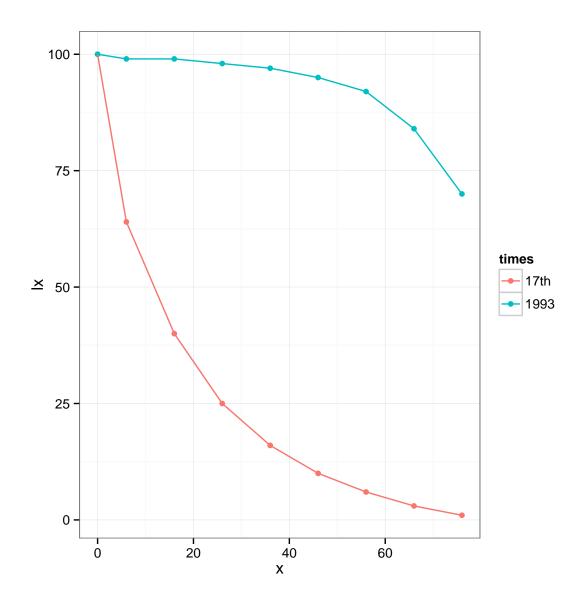
```
g1 <- ggplot() +
  geom_point(data = graunt.us.melt, aes(x = x, y = lx, colour = times)) +
  theme.pdf
g1</pre>
```



```
g2 <- g1 +
  geom_line(data = graunt.us.melt, aes(x = x, y = lx, colour = times))
g2</pre>
```

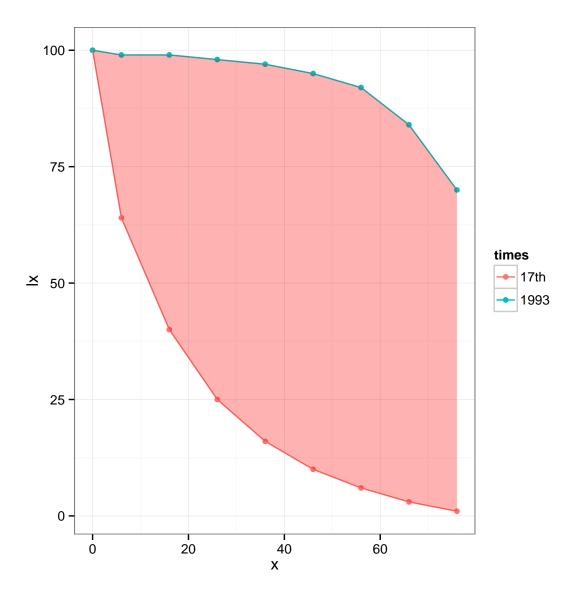




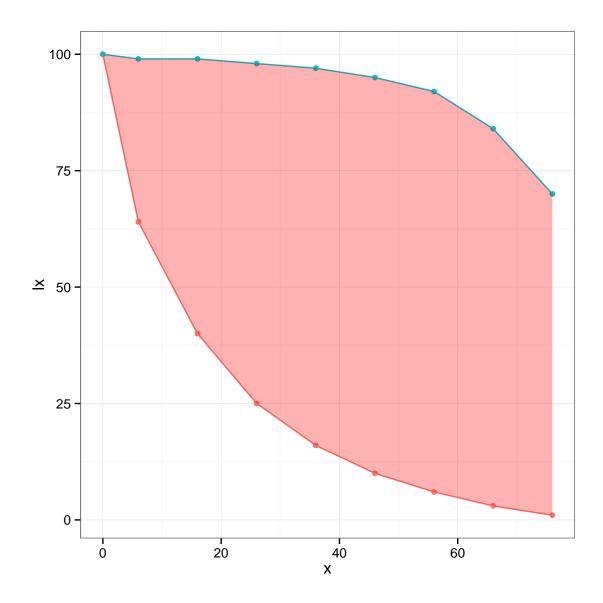


 ${\bf Polygon} \quad {\bf Reuse\ us.graunt.x\ and\ us.graunt.y\ for\ polygon()}.\ {\bf Note\ how\ to\ remove\ default\ legends}.$

```
par(family = "Helvetica")
p3 <- g3 +
  geom_polygon(data = data.frame(x = us.graunt.x, y = us.graunt.y), aes(x = x, y = y), alpha = 0.3, fil
p3</pre>
```



```
p4 <- p3 +
  guides(colour = "none")
p4</pre>
```

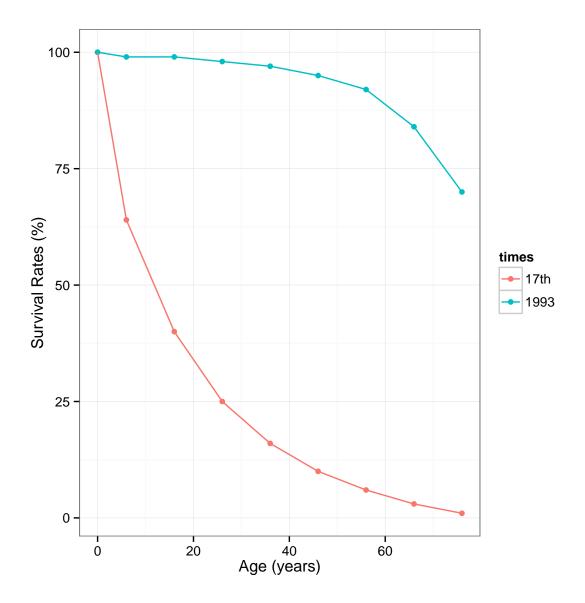


Change default annotations

Points and Lines

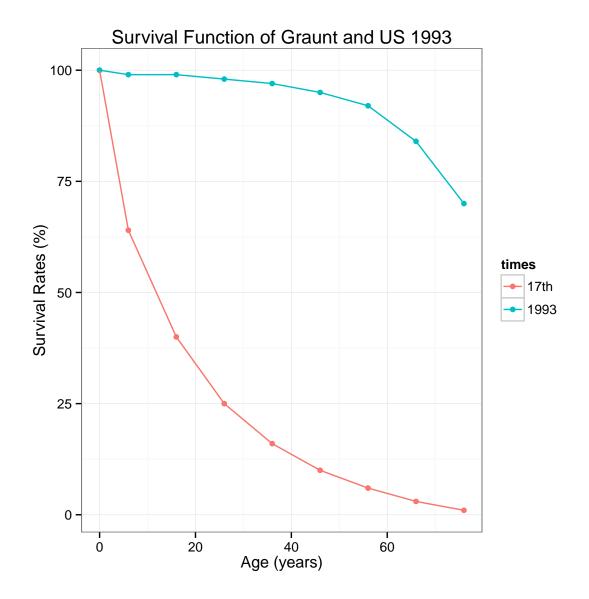
1. Change the x-axis and y-axis labels

```
(g4 <- g3 + xlab(x.lab) + ylab(y.lab))
```



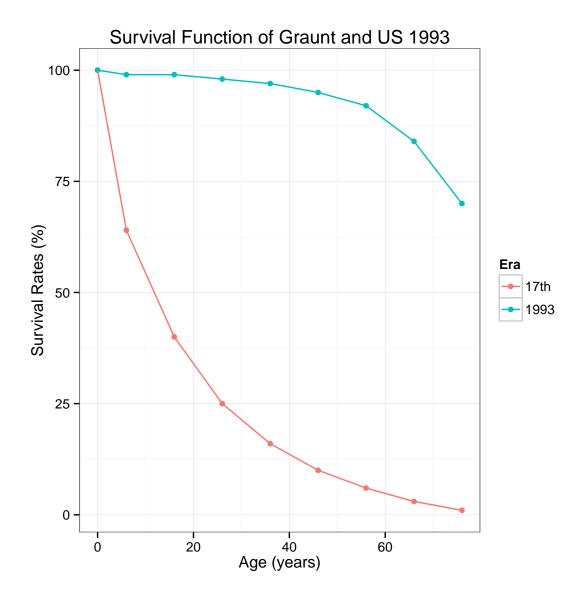
2. Main title

```
(g4 <- g3 +
    xlab(x.lab) +
    ylab(y.lab) +
    ggtitle(main.title.g.us))</pre>
```



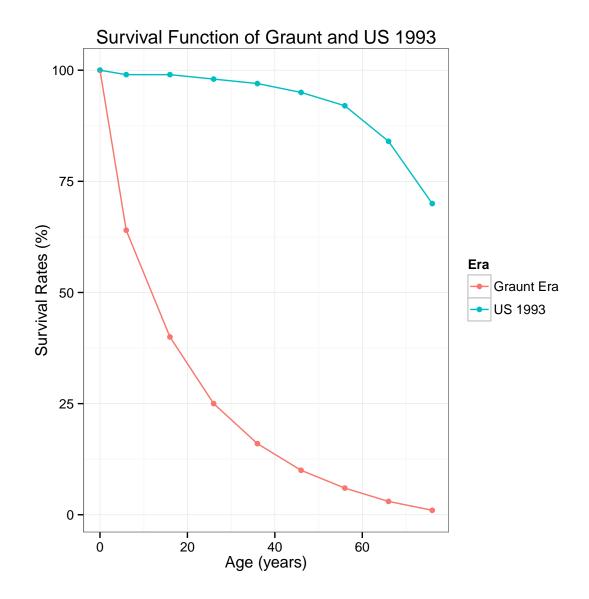
3. Change legend title

```
(g4 <- g3 +
    xlab(x.lab) +
    ylab(y.lab) +
    ggtitle(main.title.g.us) +
    labs(colour = "Era"))</pre>
```

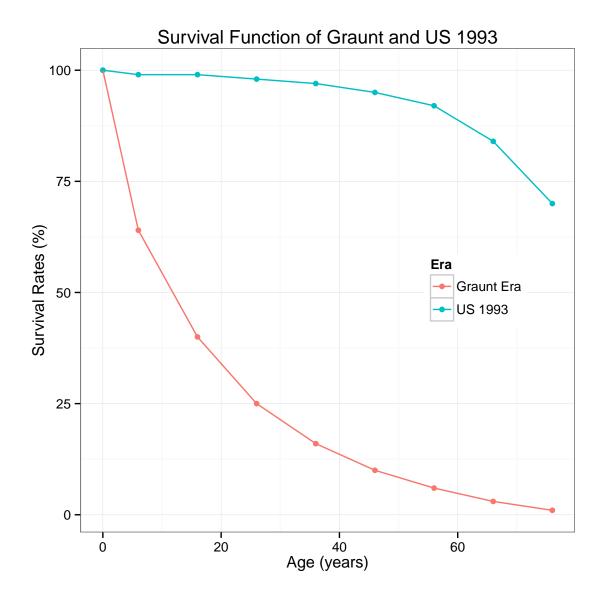


4. Change legends.

```
(g4 <- g3 +
    xlab(x.lab) +
    ylab(y.lab) +
    ggtitle(main.title.g.us) +
    labs(colour = "Era") +
    scale_colour_discrete(labels = c("Graunt Era", "US 1993")))</pre>
```

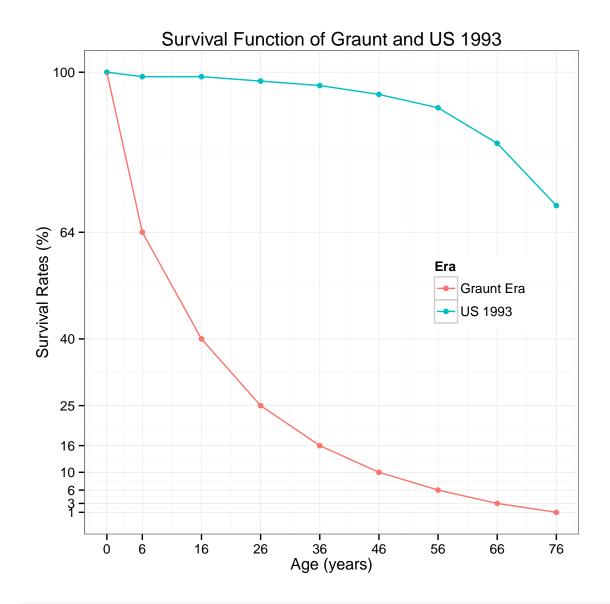


5. Place legends inside the plot



6. Change x-axis and y-axis tick marks

```
(g6 <- g5 +
    scale_x_continuous(breaks = graunt$x) + scale_y_continuous(breaks = graunt$lx.17th))</pre>
```



ggsave("../pics/graunt_us_plot.png", g6)

```
## Saving 6 x 6 in image

## Warning in grid.Call(L_textBounds, as.graphicsAnnot(x$label), x$x, x$y, :
## font family not found in Windows font database

## Warning in grid.Call(L_textBounds, as.graphicsAnnot(x$label), x$x, x$y, :
## font family not found in Windows font database

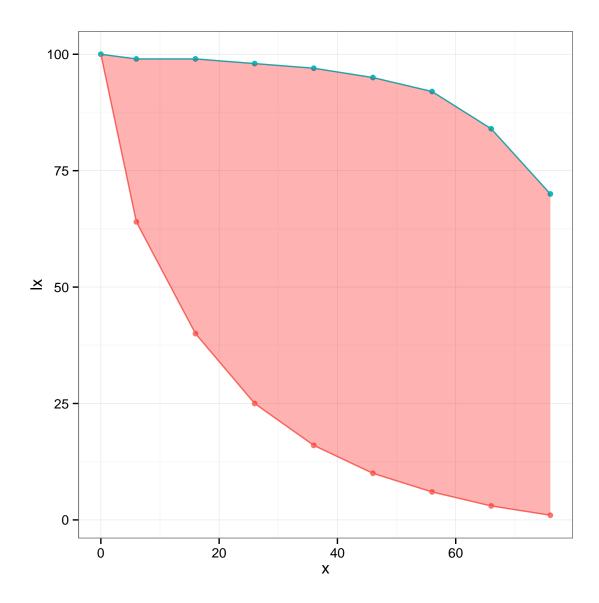
## Warning in grid.Call(L_textBounds, as.graphicsAnnot(x$label), x$x, x$y, :
## font family not found in Windows font database

## Warning in grid.Call(L_textBounds, as.graphicsAnnot(x$label), x$x, x$y, :
## font family not found in Windows font database
```

```
## Warning in grid.Call(L_textBounds, as.graphicsAnnot(x$label), x$x, x$y, :
## font family not found in Windows font database
## Warning in grid.Call(L_textBounds, as.graphicsAnnot(x$label), x$x, x$y, :
## font family not found in Windows font database
## Warning in grid.Call(L_textBounds, as.graphicsAnnot(x$label), x$x, x$y, :
## font family not found in Windows font database
## Warning in grid.Call(L_textBounds, as.graphicsAnnot(x$label), x$x, x$y, :
## font family not found in Windows font database
## Warning in grid.Call(L_textBounds, as.graphicsAnnot(x$label), x$x, x$y, :
## font family not found in Windows font database
## Warning in grid.Call(L_textBounds, as.graphicsAnnot(x$label), x$x, x$y, :
## font family not found in Windows font database
## Warning in grid.Call(L_textBounds, as.graphicsAnnot(x$label), x$x, x$y, :
## font family not found in Windows font database
## Warning in grid.Call.graphics(L_text, as.graphicsAnnot(x$label), x$x, x
## $y, : font family not found in Windows font database
## Warning in grid.Call.graphics(L_text, as.graphicsAnnot(x$label), x$x, x
## $y, : font family not found in Windows font database
## Warning in grid.Call.graphics(L_text, as.graphicsAnnot(x$label), x$x, x
## $y, : font family not found in Windows font database
## Warning in grid.Call.graphics(L_text, as.graphicsAnnot(x$label), x$x, x
## $y, : font family not found in Windows font database
## Warning in grid.Call.graphics(L_text, as.graphicsAnnot(x$label), x$x, x
## $y, : font family not found in Windows font database
Polygon Add information to the plot drawn with polygon()
```

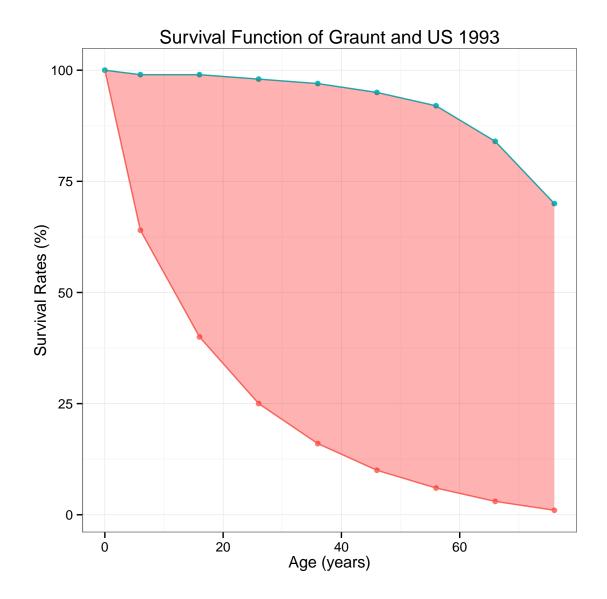
1. Start with p4

p4



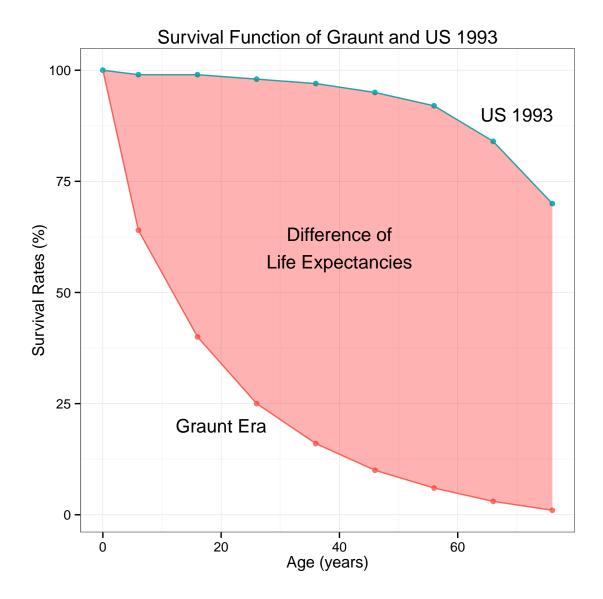
2. Main title, x-axis and y-axis labels

```
(p5 <- p4 +
    xlab(x.lab) +
    ylab(y.lab) +
    ggtitle(main.title.g.us))</pre>
```



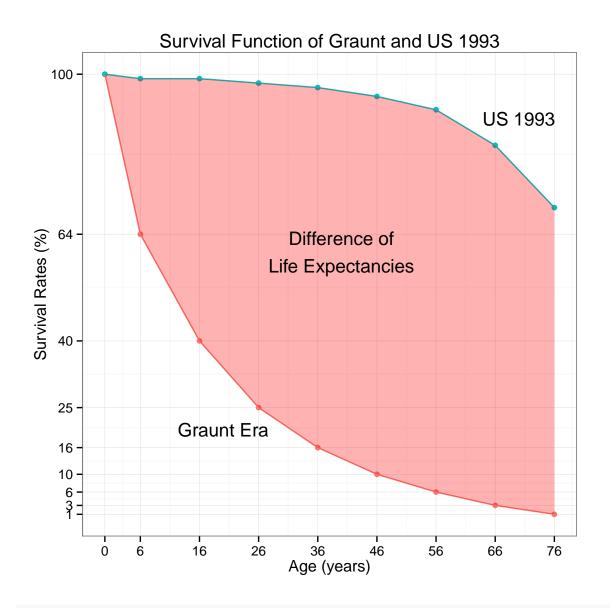
3. "Graunt Era", "US 1993", "Difference of Life Expectancies" at proper positions

```
(p6 <- p5 + annotate("text", x = c(20, 40, 70), y = c(20, 60, 90), label = c("Graunt Era", "Difference of\nLife")
```



4. x-axis and y-axis tick marks

```
(p7 <- p6 +
    scale_x_continuous(breaks = graunt$x) + scale_y_continuous(breaks = graunt$lx.17th))</pre>
```



ggsave("../pics/graunt_us_poly.png", p7)

```
## Saving 6 x 6 in image
## Warning in grid.Call(L_textBounds, as.graphicsAnnot(x$label), x$x, x$y, :
## font family not found in Windows font database
## Warning in grid.Call(L_textBounds, as.graphicsAnnot(x$label), x$x, x$y, :
## font family not found in Windows font database
## Warning in grid.Call(L_textBounds, as.graphicsAnnot(x$label), x$x, x$y, :
## font family not found in Windows font database
## Warning in grid.Call(L_textBounds, as.graphicsAnnot(x$label), x$x, x$y, :
## font family not found in Windows font database
```

```
## Warning in grid.Call(L_textBounds, as.graphicsAnnot(x$label), x$x, x$y, :
## font family not found in Windows font database
## Warning in grid.Call(L_textBounds, as.graphicsAnnot(x$label), x$x, x$y, :
## font family not found in Windows font database
## Warning in grid.Call(L_textBounds, as.graphicsAnnot(x$label), x$x, x$y, :
## font family not found in Windows font database
## Warning in grid.Call(L_textBounds, as.graphicsAnnot(x$label), x$x, x$y, :
## font family not found in Windows font database
## Warning in grid.Call.graphics(L_text, as.graphicsAnnot(x$label), x$x, x
## $y, : font family not found in Windows font database
## Warning in grid.Call(L_textBounds, as.graphicsAnnot(x$label), x$x, x$y, :
## font family not found in Windows font database
## Warning in grid.Call.graphics(L_text, as.graphicsAnnot(x$label), x$x, x
## $y, : font family not found in Windows font database
## Warning in grid.Call.graphics(L_text, as.graphicsAnnot(x$label), x$x, x
## $y, : font family not found in Windows font database
## Warning in grid.Call.graphics(L_text, as.graphicsAnnot(x$label), x$x, x
## $y, : font family not found in Windows font database
```

Graunt and Halley

Data Reshaping Since the observed ages are different, we need to final structure of the data frame to be melted. So, create copies of graunt and halley and extract parts of what we need and give feasible names.

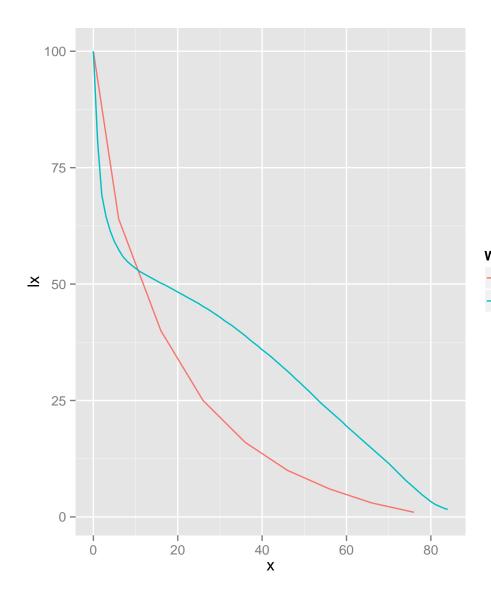
```
graunt.2 <- graunt
names(graunt.2) <- c("x", "Graunt")
halley.2 <- halley[-2]
names(halley.2) <- c("x", "Halley")
graunt.halley.melt <- melt(list(graunt.2, halley.2), id.vars = "x", value.name = "lx", variable.name =
str(graunt.halley.melt)

## 'data.frame': 94 obs. of 4 variables:
## $ x : num 0 6 16 26 36 46 56 66 76 0 ...
## $ Who: Factor w/ 2 levels "Graunt", "Halley": 1 1 1 1 1 1 1 1 1 2 ...
## $ lx : num 100 64 40 25 16 10 6 3 1 100 ...
## $ L1 : int 1 1 1 1 1 1 1 2 ...

graunt.halley.melt <- graunt.halley.melt[-4]
graunt.halley.melt.g <- subset(graunt.halley.melt, graunt.halley.melt$x %in% graunt$x)
head(graunt.halley.melt.g, n = 20)</pre>
```

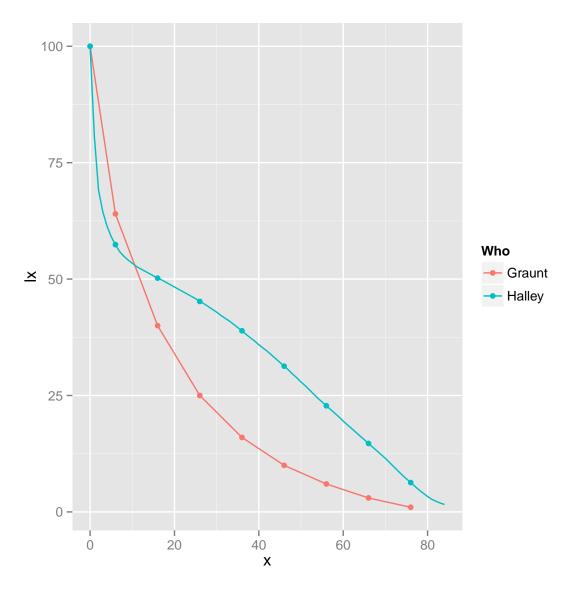
```
## x
          Who
## 1 0 Graunt 100.0
## 2 6 Graunt 64.0
## 3 16 Graunt 40.0
## 4 26 Graunt 25.0
## 5 36 Graunt 16.0
## 6 46 Graunt 10.0
## 7 56 Graunt 6.0
## 8 66 Graunt
                3.0
## 9 76 Graunt 1.0
## 10 0 Halley 100.0
## 16 6 Halley 57.4
## 26 16 Halley 50.2
## 36 26 Halley 45.2
## 46 36 Halley 38.9
## 56 46 Halley 31.3
## 66 56 Halley 22.8
## 76 66 Halley 14.7
## 86 76 Halley 6.3
```

```
gh1 <- ggplot() +
  geom_line(data = graunt.halley.melt, aes(x = x, y = lx, colour = Who)) +
  theme.pdf
gh1</pre>
```

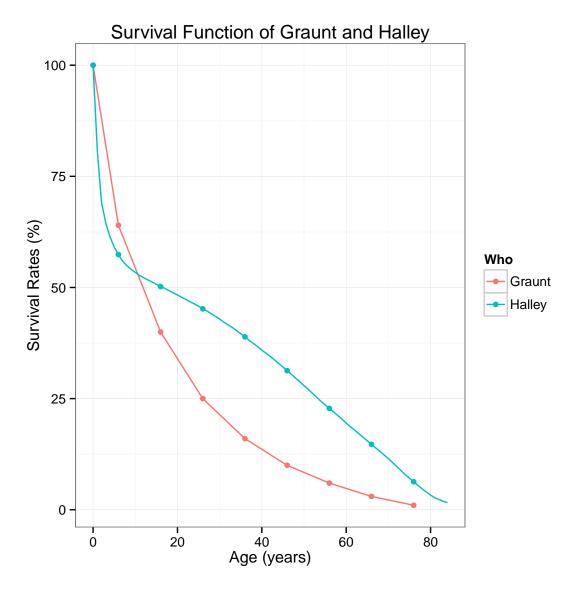


Survival Function, Step by Step

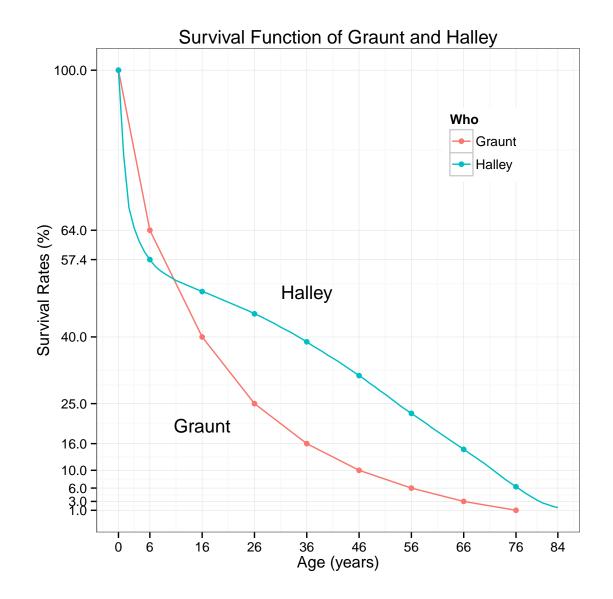
```
gh2 <- gh1 +
   geom_point(data = graunt.halley.melt.g, aes(x = x, y = lx, colour = Who))
gh2</pre>
```



```
gh3 <- gh2 +
  theme_bw() +
  theme.pdf +
  xlab(x.lab) +
   ylab(y.lab) +
  ggtitle(main.title.2)
gh3</pre>
```



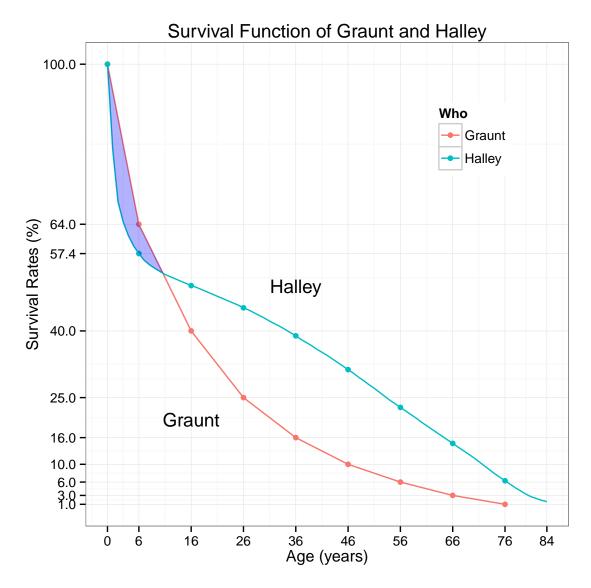
```
gh4 <- gh3 +
  theme(legend.position = c(0.8, 0.8)) +
  annotate("text", x = c(16, 36), y = c(20, 50), label = c("Graunt", "Halley")) +
  scale_x_continuous(breaks = c(graunt$x, 84)) +
  scale_y_continuous(breaks = c(graunt$lx.17th, halley$px[halley$age == 6]))
gh4</pre>
```



ggsave("../pics/graunt_halley_ggplot.png", gh4)

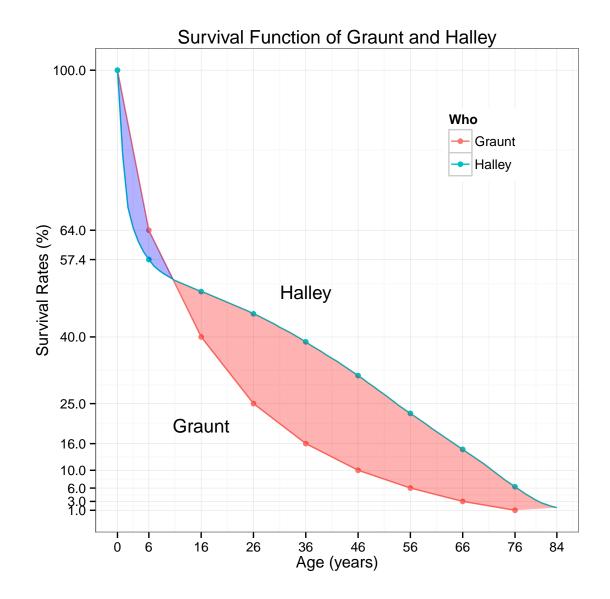
```
## Saving 6 x 6 in image
## Warning in grid.Call(L_textBounds, as.graphicsAnnot(x$label), x$x, x$y, :
## font family not found in Windows font database
## Warning in grid.Call(L_textBounds, as.graphicsAnnot(x$label), x$x, x$y, :
## font family not found in Windows font database
## Warning in grid.Call(L_textBounds, as.graphicsAnnot(x$label), x$x, x$y, :
## font family not found in Windows font database
## Warning in grid.Call(L_textBounds, as.graphicsAnnot(x$label), x$x, x$y, :
## font family not found in Windows font database
```

```
## Warning in grid.Call(L_textBounds, as.graphicsAnnot(x$label), x$x, x$y, :
## font family not found in Windows font database
## Warning in grid.Call(L_textBounds, as.graphicsAnnot(x$label), x$x, x$y, :
## font family not found in Windows font database
## Warning in grid.Call(L_textBounds, as.graphicsAnnot(x$label), x$x, x$y, :
## font family not found in Windows font database
## Warning in grid.Call(L_textBounds, as.graphicsAnnot(x$label), x$x, x$y, :
## font family not found in Windows font database
## Warning in grid.Call(L_textBounds, as.graphicsAnnot(x$label), x$x, x$y, :
## font family not found in Windows font database
## Warning in grid.Call(L_textBounds, as.graphicsAnnot(x$label), x$x, x$y, :
## font family not found in Windows font database
## Warning in grid.Call(L_textBounds, as.graphicsAnnot(x$label), x$x, x$y, :
## font family not found in Windows font database
## Warning in grid.Call.graphics(L_text, as.graphicsAnnot(x$label), x$x, x
## $y, : font family not found in Windows font database
## Warning in grid.Call.graphics(L_text, as.graphicsAnnot(x$label), x$x, x
## $y, : font family not found in Windows font database
## Warning in grid.Call.graphics(L_text, as.graphicsAnnot(x$label), x$x, x
## $y, : font family not found in Windows font database
## Warning in grid.Call.graphics(L_text, as.graphicsAnnot(x$label), x$x, x
## $y, : font family not found in Windows font database
## Warning in grid.Call.graphics(L_text, as.graphicsAnnot(x$label), x$x, x
## $y, : font family not found in Windows font database
ghp4 \leftarrow gh4 +
  geom_polygon(data = data.frame(x = poly.1.x, y = poly.1.y), aes(x = x, y = y), alpha = 0.3, fill = "b
ghp4
```



Polygon

```
ghp5 <- ghp4 +
  geom_polygon(data = data.frame(x = poly.2.x, y = poly.2.y), aes(x = x, y = y), alpha = 0.3, fill = "r
ghp5</pre>
```



ggsave("../pics/graunt_halley_poly_ggplot.png", ghp5)

```
## Saving 6 x 6 in image

## Warning in grid.Call(L_textBounds, as.graphicsAnnot(x$label), x$x, x$y, :
## font family not found in Windows font database

## Warning in grid.Call(L_textBounds, as.graphicsAnnot(x$label), x$x, x$y, :
## font family not found in Windows font database

## Warning in grid.Call(L_textBounds, as.graphicsAnnot(x$label), x$x, x$y, :
## font family not found in Windows font database

## Warning in grid.Call(L_textBounds, as.graphicsAnnot(x$label), x$x, x$y, :
## font family not found in Windows font database
```

```
## Warning in grid.Call(L_textBounds, as.graphicsAnnot(x$label), x$x, x$y, :
## font family not found in Windows font database
## Warning in grid.Call(L_textBounds, as.graphicsAnnot(x$label), x$x, x$y, :
## font family not found in Windows font database
## Warning in grid.Call(L textBounds, as.graphicsAnnot(x$label), x$x, x$y, :
## font family not found in Windows font database
## Warning in grid.Call(L_textBounds, as.graphicsAnnot(x$label), x$x, x$y, :
## font family not found in Windows font database
## Warning in grid.Call(L_textBounds, as.graphicsAnnot(x$label), x$x, x$y, :
## font family not found in Windows font database
## Warning in grid.Call(L_textBounds, as.graphicsAnnot(x$label), x$x, x$y, :
## font family not found in Windows font database
## Warning in grid.Call(L_textBounds, as.graphicsAnnot(x$label), x$x, x$y, :
## font family not found in Windows font database
## Warning in grid.Call.graphics(L_text, as.graphicsAnnot(x$label), x$x, x
## $y, : font family not found in Windows font database
## Warning in grid.Call.graphics(L_text, as.graphicsAnnot(x$label), x$x, x
## $y, : font family not found in Windows font database
## Warning in grid.Call.graphics(L_text, as.graphicsAnnot(x$label), x$x, x
## $y, : font family not found in Windows font database
## Warning in grid.Call.graphics(L_text, as.graphicsAnnot(x$label), x$x, x
## $y, : font family not found in Windows font database
## Warning in grid.Call.graphics(L_text, as.graphicsAnnot(x$label), x$x, x
## $y, : font family not found in Windows font database
```

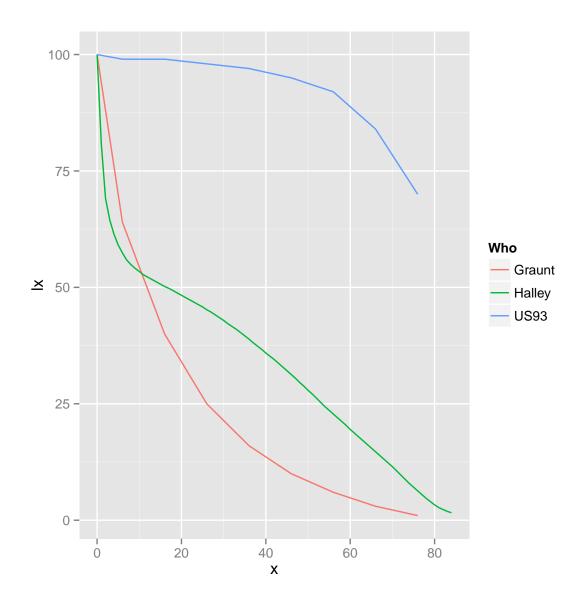
Graunt, Halley, and US93

Data Reshape

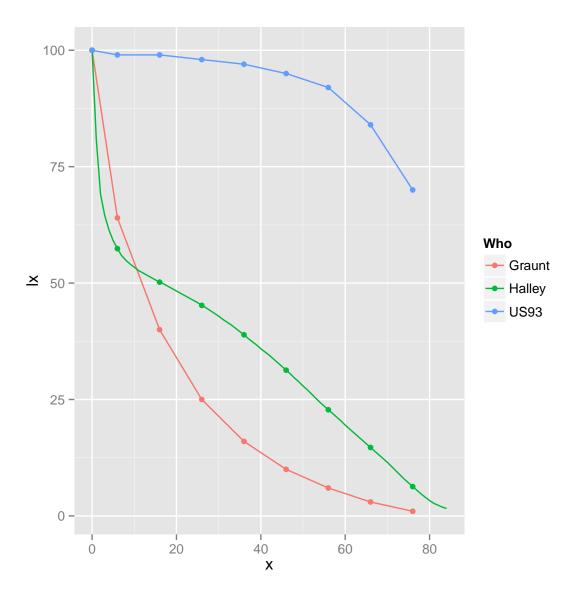
```
us93.2 <- us.93
names(us93.2) <- c("x", "US93")
ghu.melt <- melt(list(graunt.2, halley.2, us93.2), id.vars = "x", value.name = "lx", variable.name = "W.
ghu.melt.g <- ghu.melt[ghu.melt$x %in% graunt$x, ]
main.title.3 <- "Survival Function Plots"</pre>
```

Survival Function Plots with ggplot

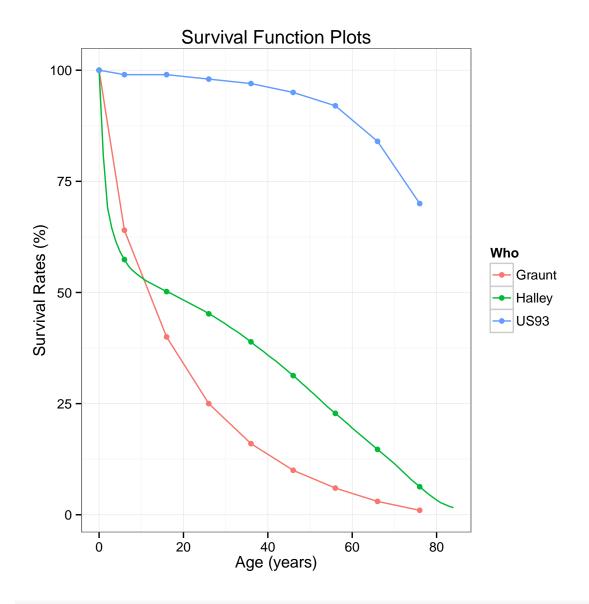
```
(ghu1 <- ggplot() +
  geom_line(data = ghu.melt, aes(x = x, y = lx, colour = Who)))</pre>
```



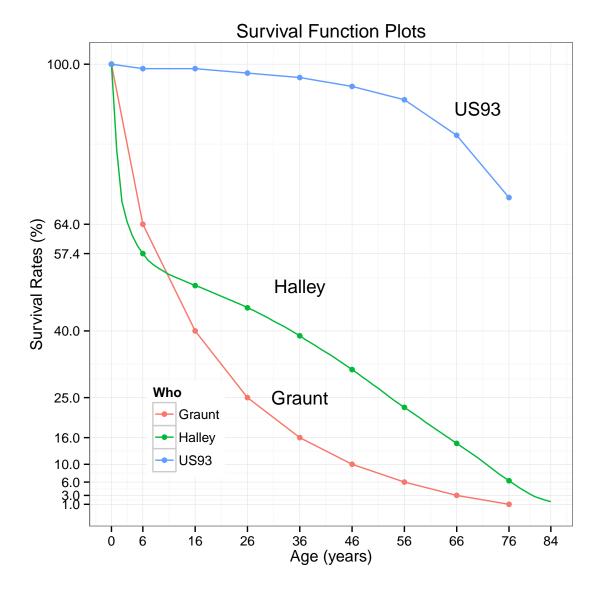
```
(ghu2 <- ghu1 +
  geom_point(data = ghu.melt.g, aes(x = x, y = lx, colour = Who)))</pre>
```



```
(ghu3 <- ghu2 +
    theme_bw() +
    xlab(x.lab) +
    ylab(y.lab) +
    ggtitle(main.title.3))</pre>
```



```
(ghu4 <- ghu3 +
    theme(legend.position = c(0.2, 0.2)) +
    annotate("text", x = c(36, 36, 70), y = c(25, 50, 90), label = c("Graunt", "Halley", "US93")) +
    scale_x_continuous(breaks = c(graunt$x, 84)) +
    scale_y_continuous(breaks = c(graunt$1x.17th, halley$px[halley$age == 6])))</pre>
```



ggsave("../pics/graunt_halley_us_ggplot.png", ghu4)

Saving 6 x 6 in image

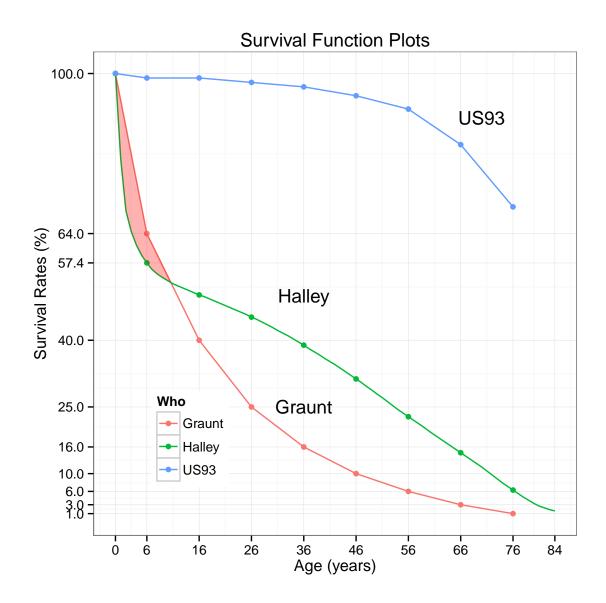
Polygon

Coordinates

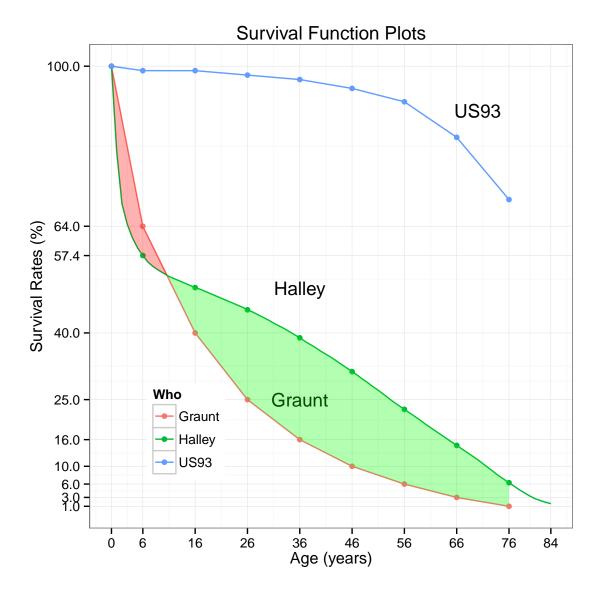
In order to make the graphs truncated at the age 76, restrict the age of Halley up to 76.

```
poly.lower.76 <- subset(poly.lower, poly.lower$x <= 76)
poly.3.x <- c(us93.2$x, halley.2$x[85:12], 10.8, graunt.2$x[2:1])
poly.3.y <- c(us93.2$US93, halley.2$Halley[85:12], 52.8, graunt.2$Graunt[2:1])
poly.us <- data.frame(x = poly.3.x, y = poly.3.y)
poly.us.76 <- subset(poly.us, poly.us$x <= 76)</pre>
```

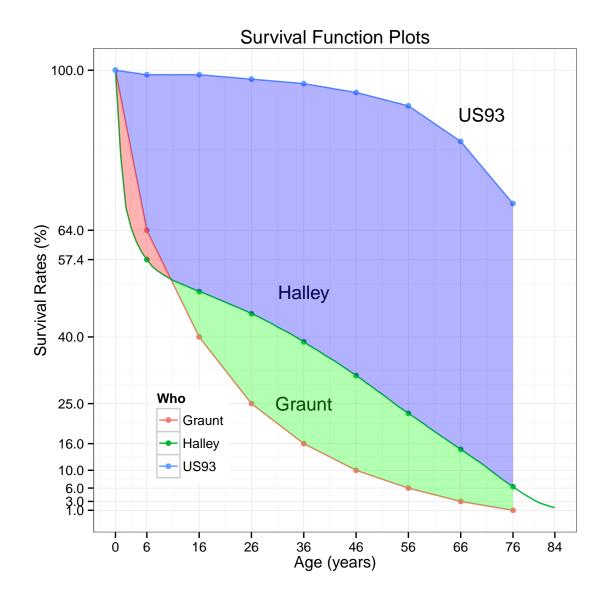
```
(ghup4 <- ghu4 +
  geom_polygon(data = poly.upper, aes(x = x, y = y), alpha = 0.3, fill = "red"))</pre>
```



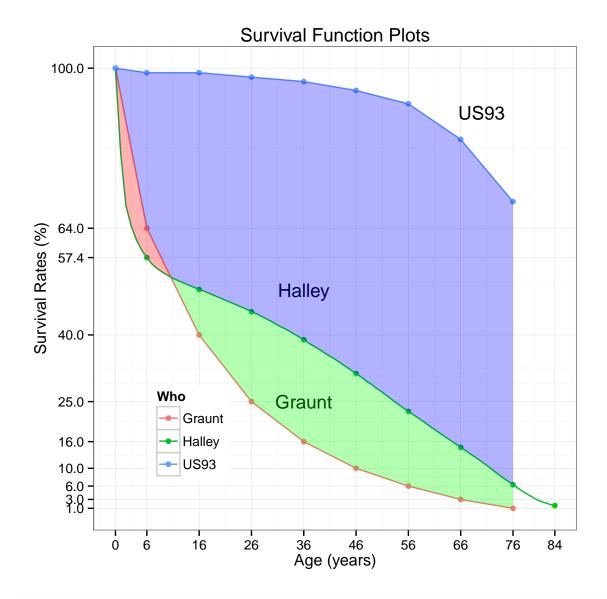
```
(ghup5 <- ghup4 +
  geom_polygon(data = poly.lower.76, aes(x = x, y = y), alpha = 0.3, fill = "green"))</pre>
```



```
(ghup6 <- ghup5 +
  geom_polygon(data = poly.us.76, aes(x = x, y = y), alpha = 0.3, fill = "blue"))</pre>
```



```
(ghup7 <- ghup6 +
  geom_point(data = data.frame(x = 84, y = halley$px[85]), aes(x = x, y = y), colour = 3))</pre>
```



ggsave("../pics/graunt_halley_us_poly_ggplot.png", ghup7)

Saving 6 x 6 in image

dump() and source()

• Check out how to save and retrieve. Use source() and load() for retrieval.

```
dump("area.R", file = "area.R")
save.image("graunt_halley_160329.rda")
```