

Spline terms with interactions in a Cox model

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This is a topic that comes up just often enough in my work that I end up re-discovering how to do it correctly about once a year. A note showing how may be useful to others, it is certainly a useful reference for me.

As an example we will use the effect of age on survival in the `flchain` data set, a population based sample of subjects from Olmsted County, Minnesota. If we look at a simple model using age and sex we see that both are very significant.

```
> require(survival)
> options(show.signif.stars=FALSE) # display intelligence
> fit1 <- coxph(Surv(futime, death) ~ sex + pspline(age, 3), data=flchain)
> fit1
```

Call:

```
coxph(formula = Surv(futime, death) ~ sex + pspline(age, 3),
      data = flchain)
```

	coef	se(coef)	se2	Chisq	DF
sexM	0.409	0.0440	0.0440	86.4	1.00
pspline(age, 3), linear	0.112	0.0022	0.0022	2589.8	1.00
pspline(age, 3), nonlin				10.9	2.09

	p
sexM	0.0000
pspline(age, 3), linear	0.0000
pspline(age, 3), nonlin	0.0048

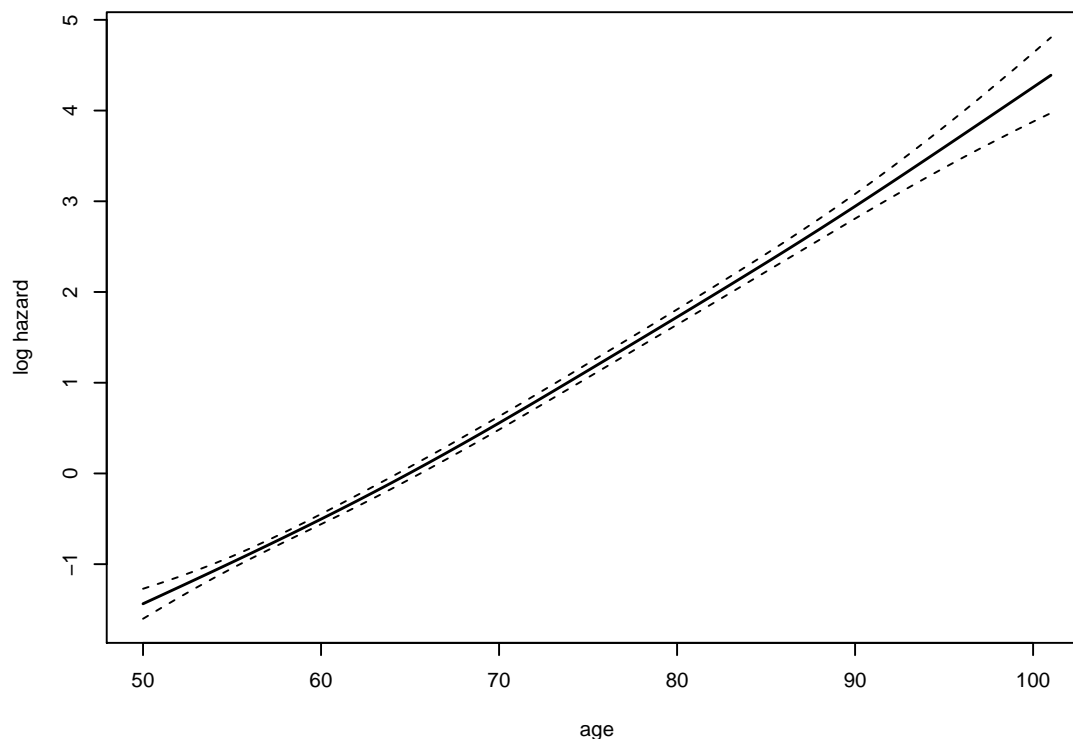
Iterations: 7 outer, 20 Newton-Raphson

Theta= 0.989

Degrees of freedom for terms= 1.0 3.1

Likelihood ratio test=2629 on 4.09 df, p=0 n= 7874

```
> termplot(fit1, term=2, se=TRUE, col.term=1, col.se=1,
           ylab="log hazard")
```



We used a smoothing spline because the printout then nicely segregates the linear and non-linear effects. The non-linearity is not very large, as compared to the linear portion, but still may be important.

We would like to go forward and fit separate age curves for the males and the females, since the above fit makes an unwarranted assumption that the male/female ratio of death rates will be the same at all ages. The primary problem is that a formula of `sex * pspline(age)` does not work; the `coxph` routine is not clever enough to do the right thing automatically. (Perhaps some future version will be sufficiently bright, but don't hold your breath). If we were using regression splines instead, e.g. `ns(age, df=4)`, the `coxph` routine would succeed but the plotting would fail; the solution below works for both cases.

We need to create our own dummy variables to handle the interaction.

```
> agem <- with(flchain, ifelse(sex=="M", age, 60))
> agef <- with(flchain, ifelse(sex=="F", age, 60))
> fit2 <- coxph(Surv(futime, death) ~ sex + pspline(agef, df=3)
+ pspline(agem, df=3), data=flchain)
> anova(fit2, fit1)
Analysis of Deviance Table
Cox model: response is Surv(futime, death)
Model 1: ~ sex + pspline(agef, df = 3) + pspline(agem, df = 3)
Model 2: ~ sex + pspline(age, 3)
loglik  Chisq      Df P(>|Chi|)
```

```

1 -17551
2 -17554 5.8211 2.8583 0.1096

```

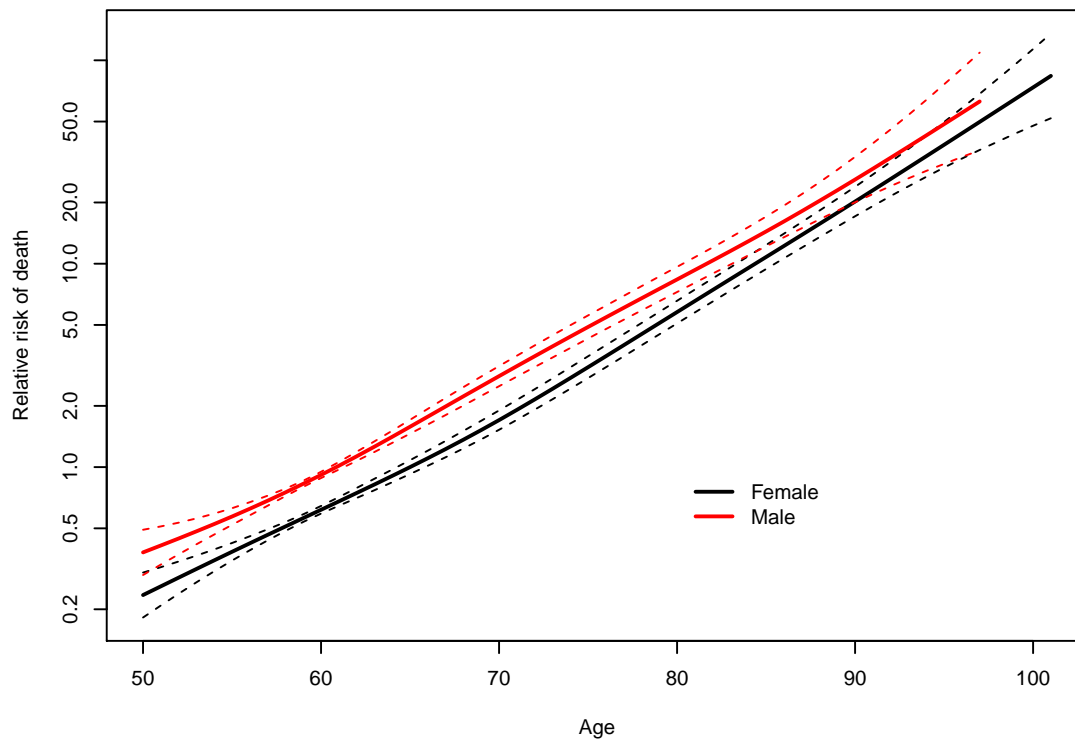
The gain in this particular problem is not great, but we will forge ahead. You might well ask why we used 60 as a dummy value of `agem` for the females instead of 0? There is nothing special about the choice, and any value within the range of ages would do as well, though I try to pick one where the standard errors of the curves are not outrageous. If a value of 0 is used it forces the `pspline` function to create a basis set that includes all the empty space between 0 and 50, and do predictions at 0; these last can become numerically unstable leading to errors or incorrect values.

The Cox model deals with relative hazards, when doing a plot we will usually want to specify who our reference is. By default the `termplot` function uses an average reference, that is, any plot will be centered to have an average log hazard of 0. In this case, we decided to use 65 year old females as our reference, with all of the hazards relative to them.

```

> # predictions
> pterm <- termplot(fit2, term=2:3, se=TRUE, plot=FALSE)
> # reference
> refdata <- data.frame(sex=c('F', 'M'), agef=c(65, 60), agem=c(60,65))
> pred.ref <- predict(fit2, newdata=refdata, type="lp")
> # females
> tempf <- pterm$agef$y + outer(pterm$agef$se, c(0, -1.96, 1.96))
> frow <- which(pterm$agef$x == 65)
> tempf <- tempf - tempf[frow,1] # shift curves
> # males
> tempm <- pterm$agem$y + outer(pterm$agem$se, c(0, -1.96, 1.96))
> mrow <- which(pterm$agem$x == 65)
> tempm <- tempm + diff(pred.ref) - tempm[mrow,1]
> # plot
> matplot(pterm$agef$x, exp(tempf), log='y', col=1,
           lty=c(1,2,2), type='l', lwd=c(2,1,1),
           xlab="Age", ylab="Relative risk of death")
> matlines(pterm$agem$x, exp(tempm), log='y',
           col=2, lwd=c(2,1,1), lty=c(1,2,2))
> legend(80, 1, c("Female", "Male"), lty=1, lwd=2, col=1:2, bty='n')

```



1. The `termplot` routine is used to get the data points for the plot, without executing a plot, by use of the `plot=FALSE` argument. The result is a list with one element per term; each element of the list contains `x`, `y`, and `se` components.
2. We had decided to center the female curve at age 65, risk =1. The relative offset for the male curve can be derived directly from `fit2` by adding up the right coefficients, and I used to do it that way but would get it wrong one time out of two. So instead use the `predict` routine to get predicted log hazards for males and females at a particular age. This tells me how far apart the curves should be at that point. We force the females to go through 0, which is $\exp(0) = 1$ on the hazard scale.
3. Get the predicted curve and confidence bands for the females as a matrix `tempf`, and then shift them by subtracting the value for a 65 year old female. Do the same for males, plus adding in the curve separation at age 65 from `pred.ref`.
4. The male and female portions don't have quite the same set of age values, there are no 95 year old males in the data set for example, so the plot needs to be done in two steps.

The final curves for males and female are not quite parallel. One thing the plot does not display is that the spacing between the male and female points also has a standard error. This moves the entire bundle of three red curves up and down. It is not clear how best to add this information into the plot. For questions of parallelism and shape, as here, it seemed best to ignore it, which is what the `termplot` function also does. If someone were reading individual male/female differences off the plot a different choice would be appropriate.