

Alberta Environment FSI Workshop

Carl Schwarz

2017-05-14

Objectives

- ▶ Create a draft Watershed Assessment Report
- ▶ How many sample locations do I need in the watershed to detect a trend?
- ▶ What is impact of stratification of samples in a watershed

Workflow

- ▶ use *R* and *RMarkdown* to do computations and create *MSWord* (or other format) draft documents that can be edited to create final report

How it works



Figure 1:

Why this approach?

- ▶ Reproducible output.
- ▶ Final output and data are easy to synchronize.
- ▶ Reduce amount of copying and pasting output from *R* to *MSWord*.

But

- ▶ You can only get 90% of the way to the final report but need some customization unless you go to the next level of *RMarkdown* using *LaTeX* (a professional typesetting program).

Computer Preparation

- ▶ Install *R* and associated packages.

Caution with *ggmaps* as current version doesn't talk nicely with Google Maps. You will need to install from GitHub

- ▶ Install *RStudio* and associated *R* packages.

- ▶ Install *JAGS* and associated *R* packages.

- ▶ Get FWIS data for your watershed.

We will use Quirk Creek as an example.

- ▶ Download material from GitHub

Visit <https://github.com/cschorz-stat-sfu-ca/ABgov-fish>

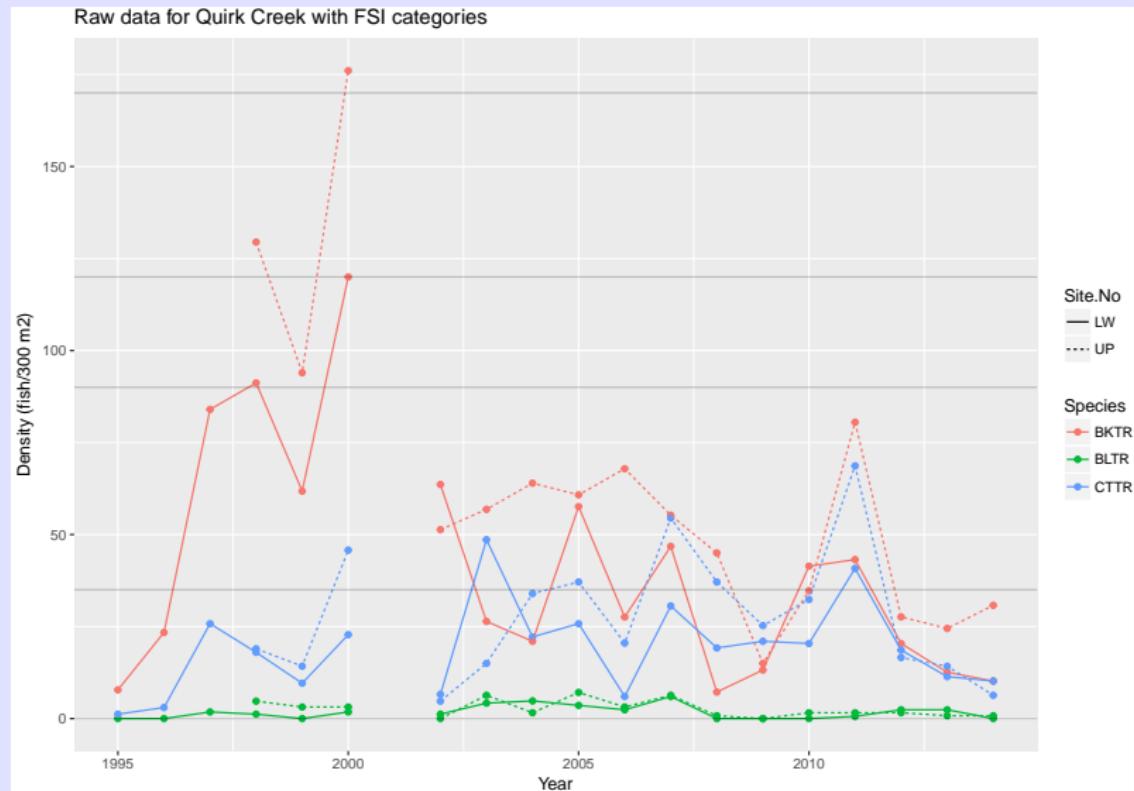
Download zip file.

Unzip zip file and discard zip file.

Watershed Assessment

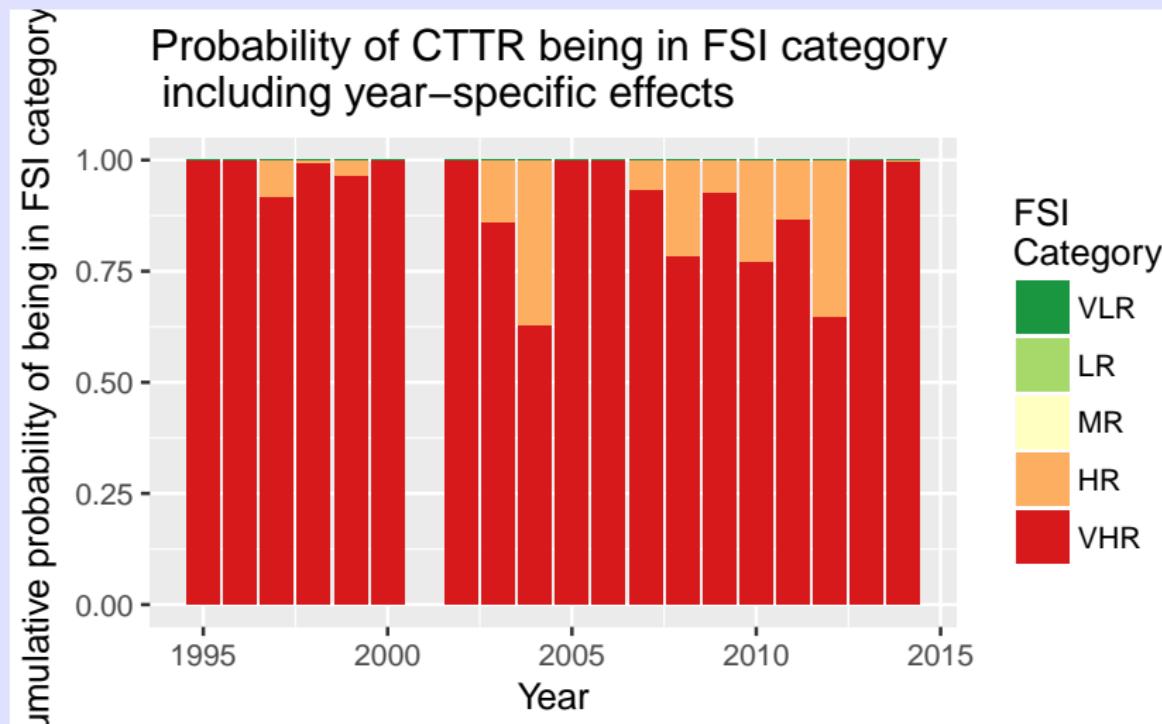
Watershed Assessment

Take this:



Watershed Assessment II

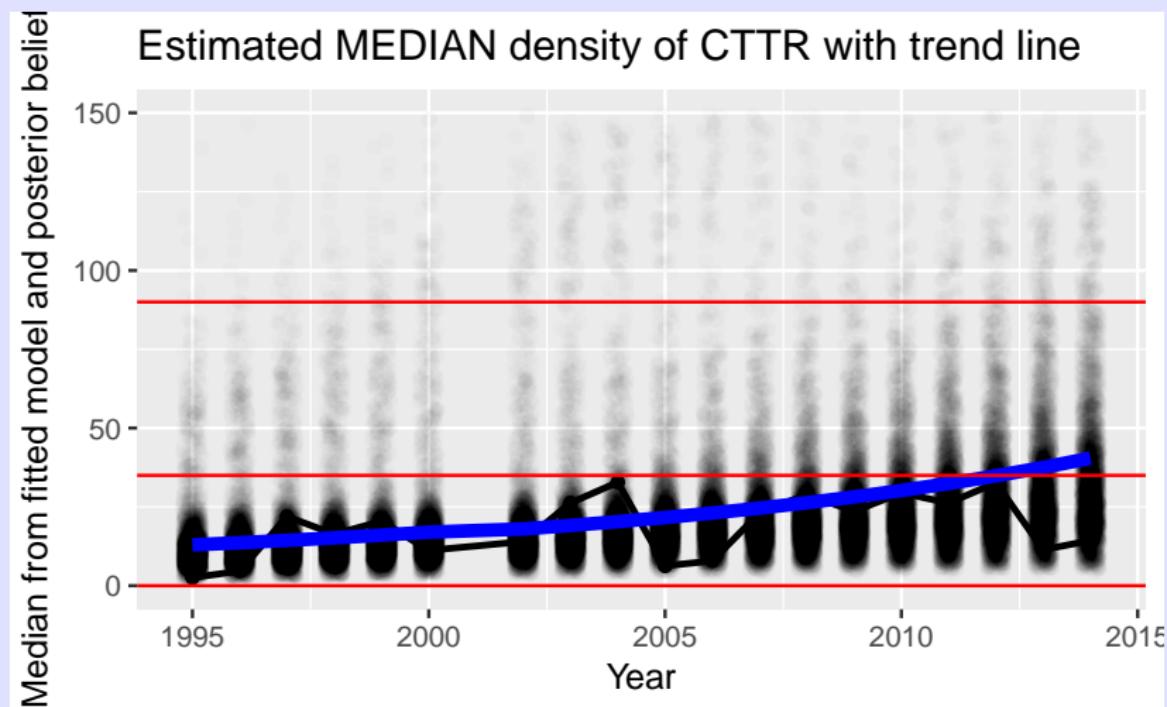
Objective: Take previous plot and classify watershed as:



But: - Year-specific effects add extra layer of variation

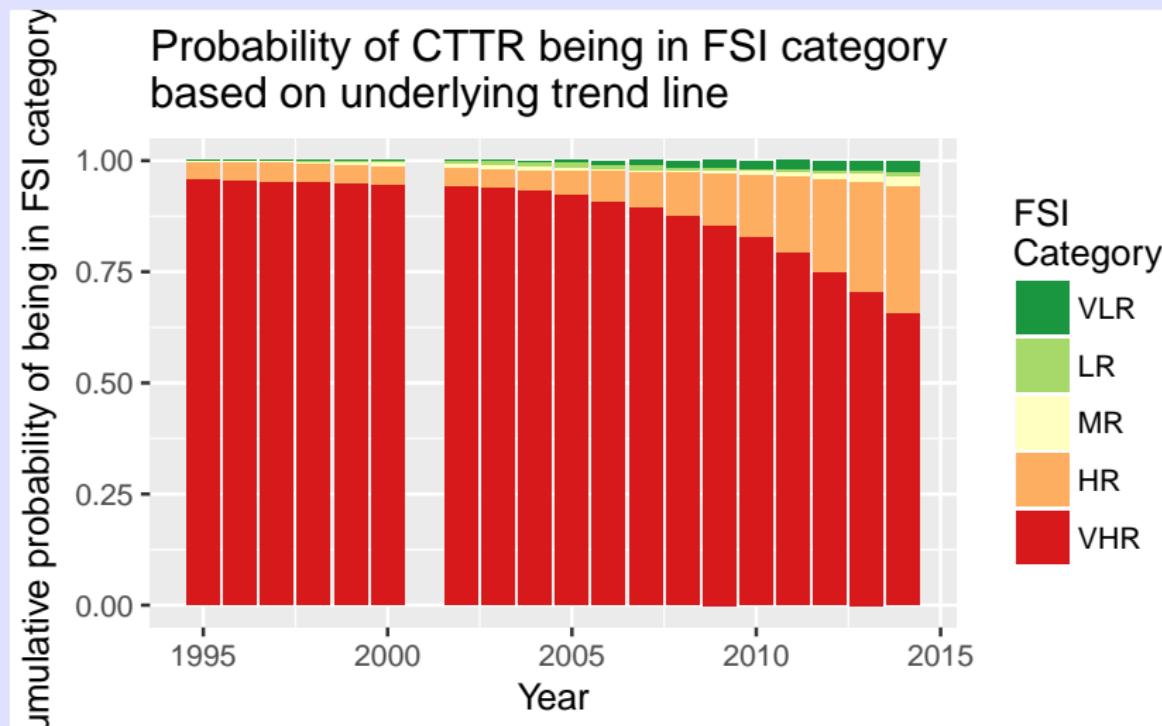
Watershed Assessment III

Estimate the underlying trend:



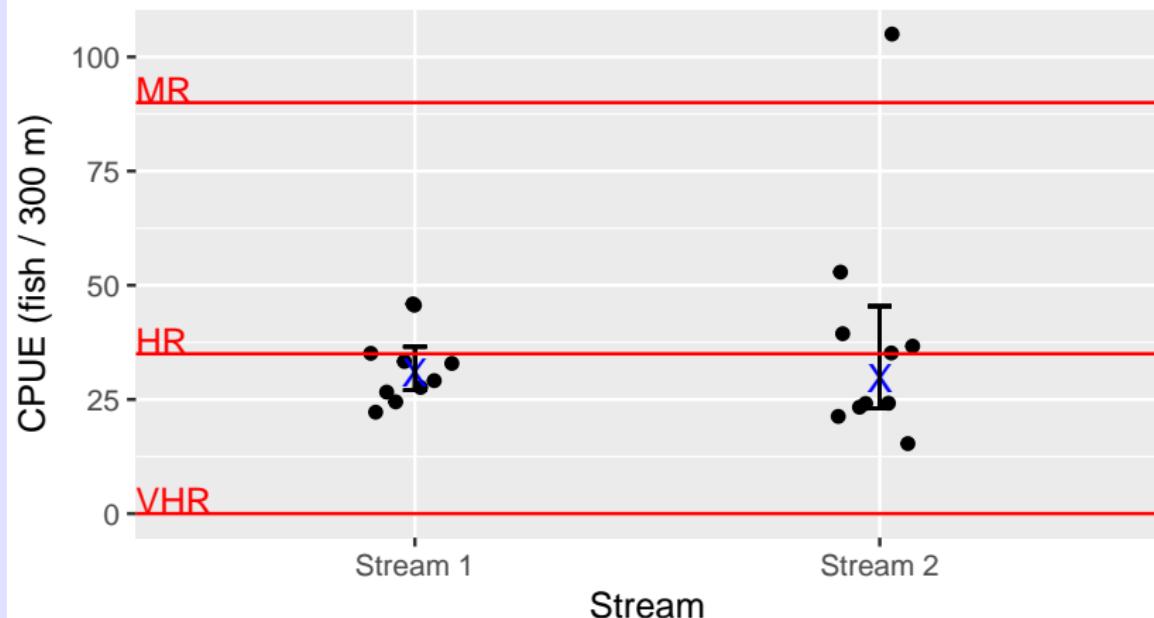
Watershed Assessment IV

Base FSI classification based on underlying trend:



Probabilistic assignment to FSI categories

Initial plot of CPUE for two streams



What is the P(median (blue X)) lies in EACH FSI category?

- ▶ Bootstrap/simulate from each set of data.
- ▶ Compute the median from each bootstrap sample.
- ▶ What proportion of medians fall in each FSI category?

Probabilistic assignment to FSI categories

Generated values for median from Stream 1:

```
log.median median
[1,]      3.61  37.03
[2,]      3.31  27.37
[3,]      3.38  29.23
[4,]      3.45  31.60
[5,]      3.43  30.87
```

Create a 0/1 indicator variable for each FSI category:

```
prob.FSI.cat[1] prob.FSI.cat[2] prob.FSI.cat[3] prob.FSI.cat[4]
[1,]          0           1           0           0
[2,]          1           0           0           0
[3,]          1           0           0           0
[4,]          1           0           0           0
[5,]          1           0           0           0
```

Probabilistic assignment to FSI categories

Repeat for many thousands of simulations:

Probability of Stream 1 in each FSI category

	Probability
prob.FSI.cat[1]	0.89
prob.FSI.cat[2]	0.11
prob.FSI.cat[3]	0.00
prob.FSI.cat[4]	0.00
prob.FSI.cat[5]	0.00

Probabilistic assignment to FSI categories

Similarly for Stream 2:

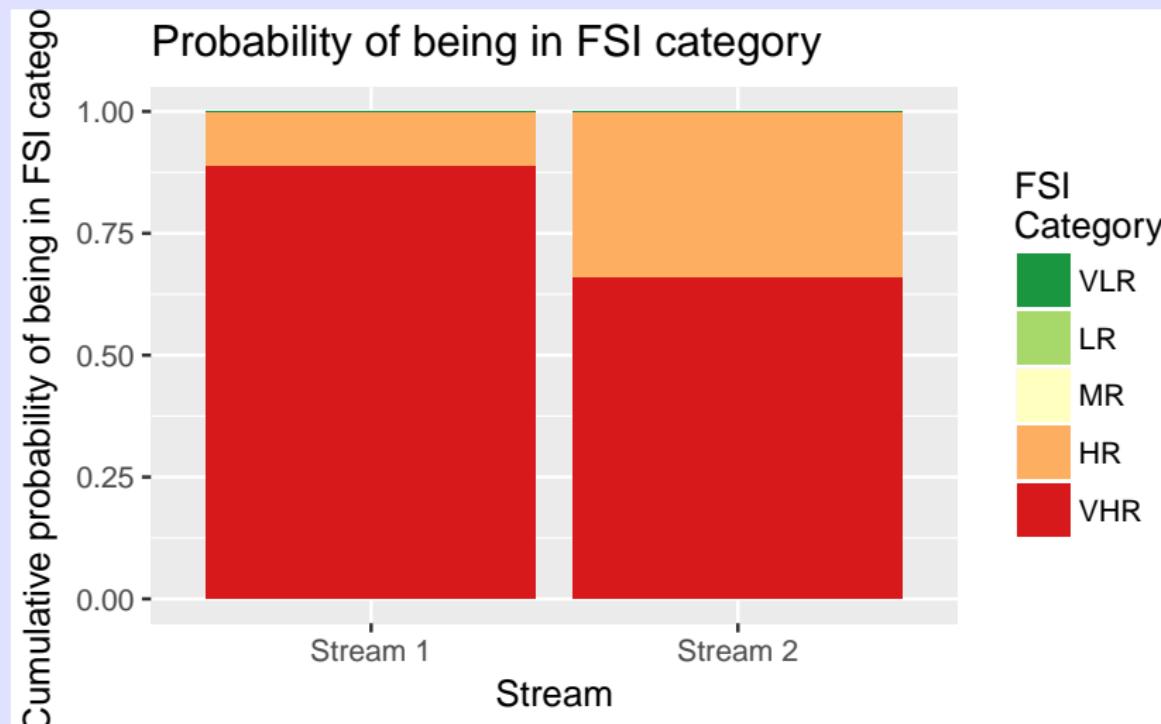
The same set of computation can be done for Stream 2 and we obtain the following results for Stream 2.

Probability of Stream 2 in each FSI category

	Probability
prob.FSI.cat[1]	0.66
prob.FSI.cat[2]	0.34
prob.FSI.cat[3]	0.00
prob.FSI.cat[4]	0.00
prob.FSI.cat[5]	0.00

Probabilistic assignment to FSI categories

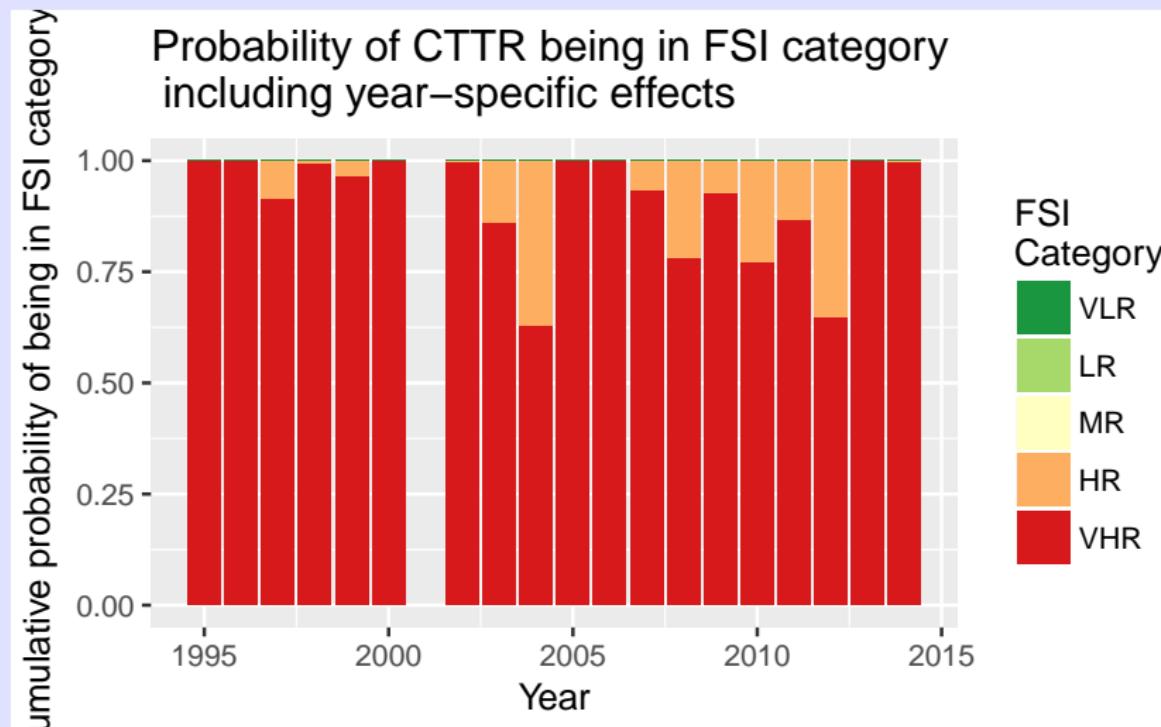
Create categories from the probabilities



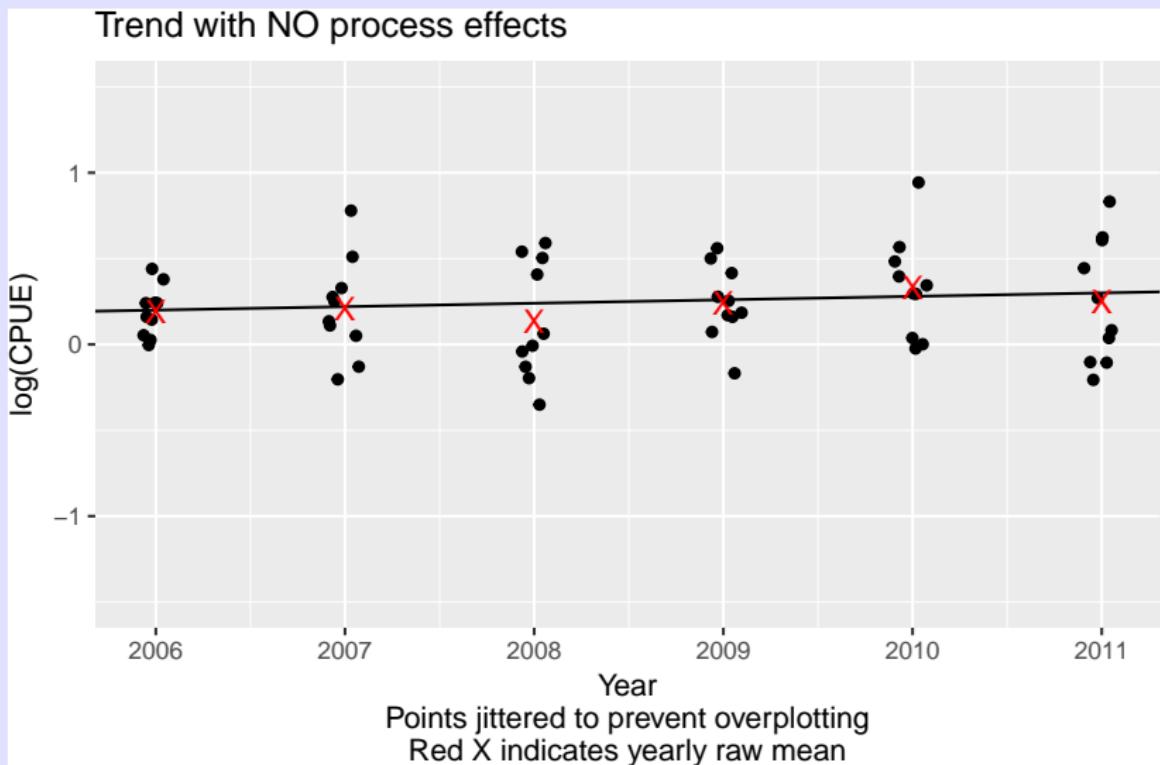
Year-Specific Effects (Process Error)

Role of process error (year-specific effects)

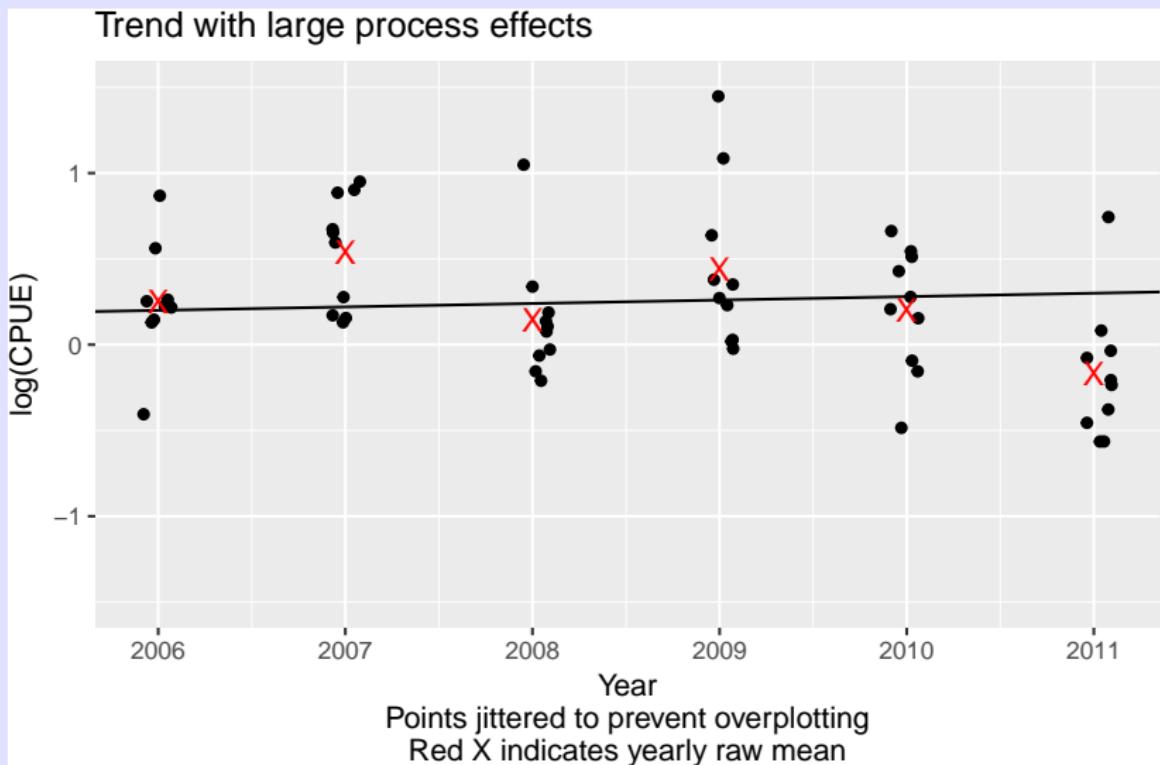
Year-specific effects add extra variation to the assessment



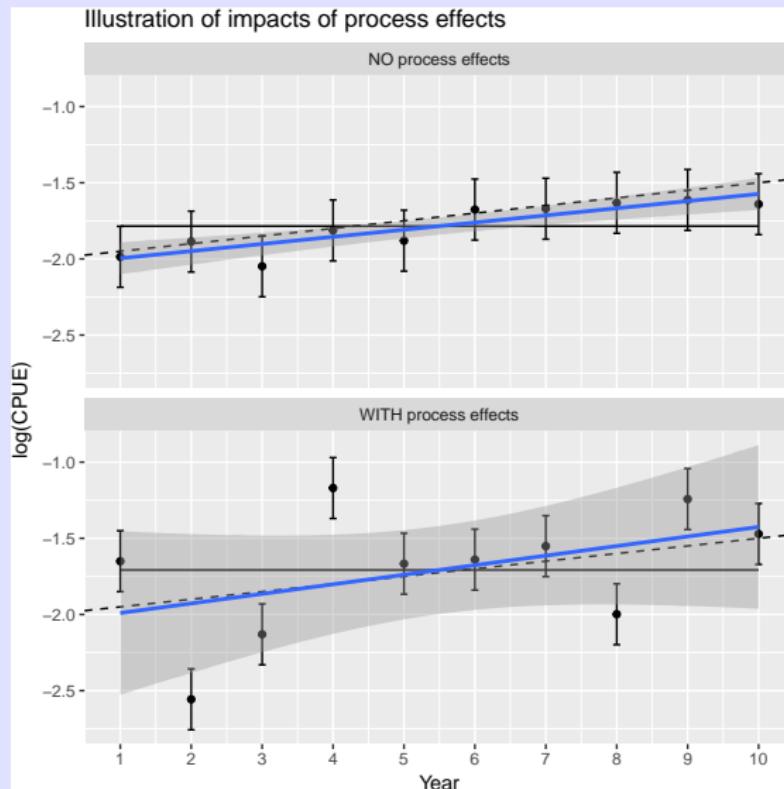
What are year-specific effects (process error)?



What are year-specific effects (process error)?



Impacts of year-specific effects (process error)



Fitting trend accounting for year-specific effects (process error)

Linear mixed model accounting for yearly trend and yearly process error:

```
plotdata.PE$YearC <- factor(plotdata.PE$Year)
mixed.fit <- lmerTest::lmer(logCPUE ~ Year + (1|YearC), data = plotdata)
summary(mixed.fit)$coefficients
```

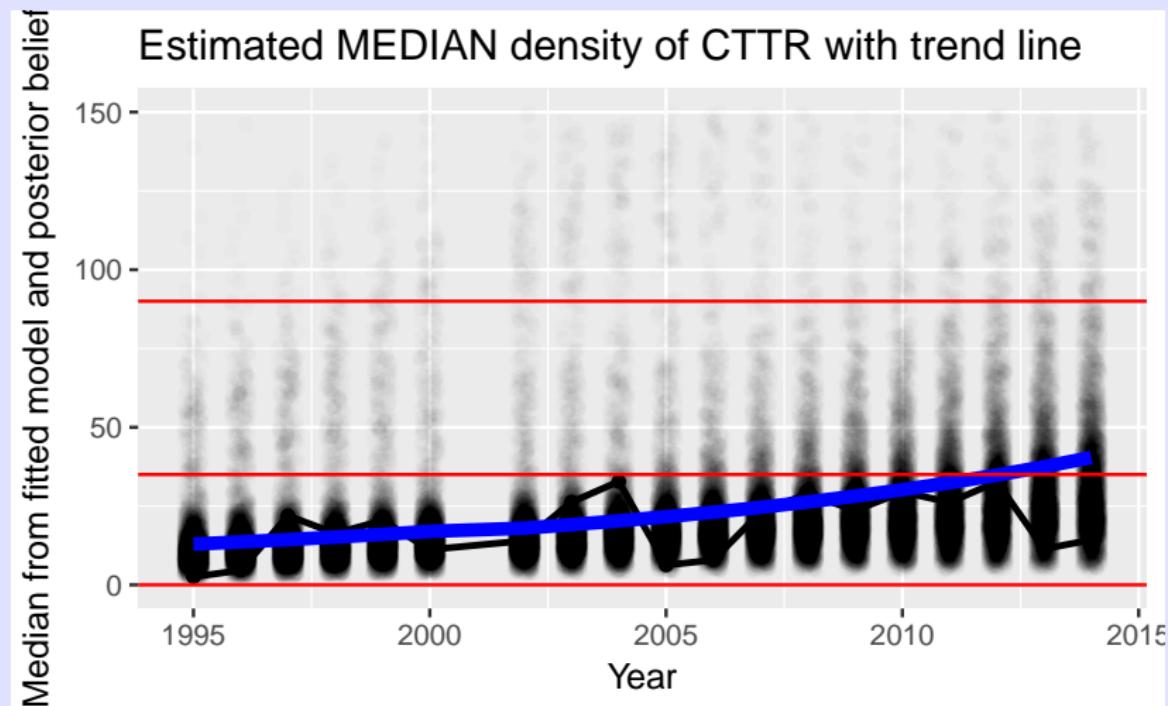
```
##                                     Estimate   Std. Error      df t value
## (Intercept) 160.66702202 106.48797177 4.009495 1.508781
## Year        -0.07987644   0.05301864 4.009495 -1.506573
```

```
VarCorr(mixed.fit)
```

```
## Groups    Name       Std.Dev.
## YearC    (Intercept) 0.18682
## Residual           0.37803
```

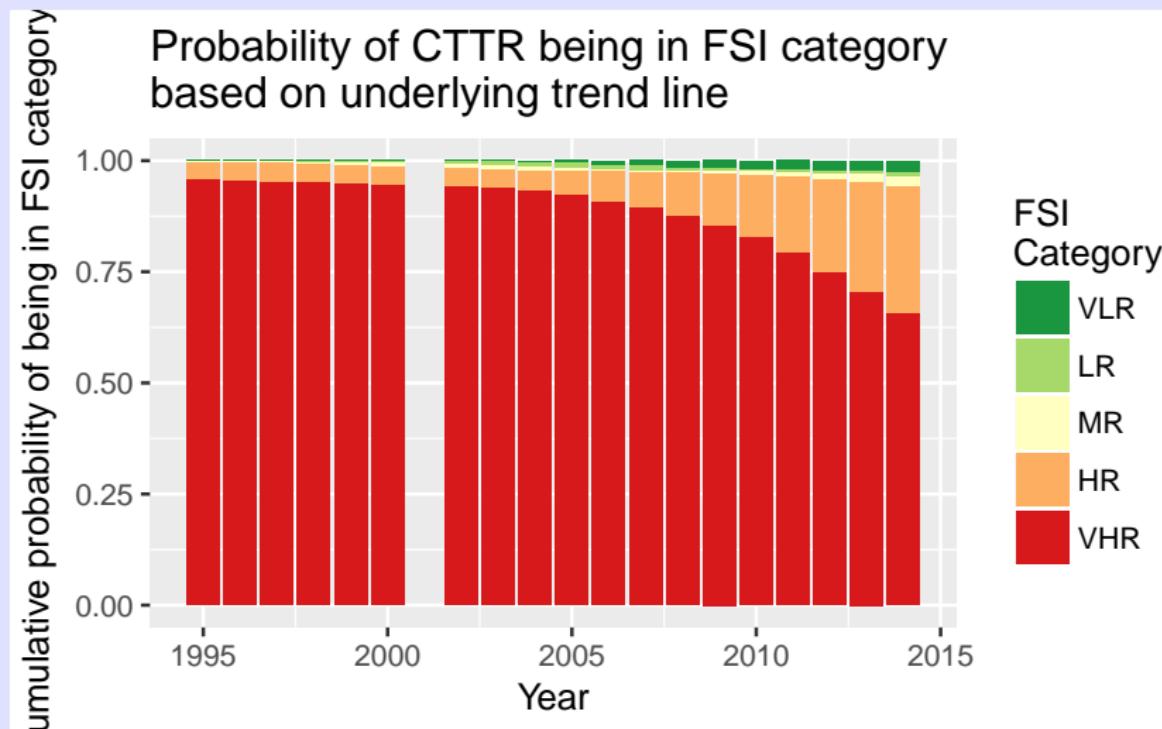
Fit trend on log(CPUE) scale

Similar LMM fit but also add SITE effects:



Fit trend on log(CPUE) scale

Assign FSI category based on variation of TREND line



Creating draft watershed assessment report

Draft watershed assessment report: Workflow

- ▶ Install *R*, *RStudio*, *JAGS* and associated packages
- ▶ Create working directory for your work.
- ▶ Download files from <https://github.com/cschorz-stat-sfu-ca/ABgov-fish> into working directory and unzip
- ▶ Move FWIS data file to Data directory of WatershedReport directory.
- ▶ Duplicate and rename *WatershedTemplate.Rmd* and *SpeciesSubsection-BKTR.Rmd*
- ▶ Clone *SpeciesSubsection-BKTR.Rmd* file.
- ▶ Edit and Run xx-*WatershedTemplate.Rmd* file.
- ▶ View xx-*WatershedTemplate.docx* until satisfied.
- ▶ Edit *docx* file for finishing touches.

RMarkdown: Combining *R* and text into a single report.

Types of chunks:

- ▶ The headers (between the —'s)
- ▶ Code chunks. These are sections of *R* code of the form delimited by triple BACK quotes with *R* code in between.
- ▶ Text that includes results of *R* expressions

Using *RMarkdown*

- ▶ Run complete chunks using the *Run* menu item in *RStudio*.
- ▶ Run sections of code by highlighting and pressing CTRL-R (Windows) or CMD-Return (Macintosh)
- ▶ Help available from *RStudio* Help menu and Google
<http://rmarkdown.rstudio.com>
<https://yihui.name/knitr/options/>

Basic steps to creating draft watershed assessment report

- ▶ Carefully go through first *R* code chunk ensuring that data has been entered properly, and making sure that you select proper subset, clean up any coding errors, etc
- ▶ Run main document (excluding Species sections) until happy.
- ▶ Do ONE species at a time template revisions until done.
- ▶ Write your final summary message.
- ▶ Finally *knit* everything together into final *MSWord* document.

Exercise: Quirk Creek Watershed Assessment

Refer to detailed document in the WatershedReport directory.

How many years do I need to sample to detect a trend?

Detecting a trend

Power to detect a trend depends on

- ▶ Size of trend to detect. Larger trends are easier to detect than smaller trends.
- ▶ Sample size
 - ▶ Number of years of sampling.
 - ▶ Number of sites sampled each year.
- ▶ Variance components (noise)
 - ▶ Year-specific effect standard deviation (process error)
 - ▶ Site-to-Site effect standard deviation (cancels when the site is repeatedly measured over time)
 - ▶ Residual noise standard deviation.

The year-specific effects standard deviation is OFTEN THE LIMITING factor and CANNOT BE CONTROLLED!

- ▶ Not necessary to sample large number of sites in each year.

Detecting a trend - workflow

- ▶ Read in and edit FWIS data as before
- ▶ Estimate the variance components (standard deviations)
- ▶ Estimate power to detect various size trends under different scenarios
- ▶ Plot the data
- ▶ Be demoralized.

Exercise: Quirk Creek Power and Sample Size

Refer to detailed document in TrendPowerAnalysis directory.

Impact of stratification

Impact of different types of stratification

Uncertainty in estimating median in a year may be due to other variables such as

- ▶ HUC Classification
- ▶ Stream Order
- ▶ Other variables

If this uncertainty could be reduced, it may improve the FSI categorization

BUT

- ▶ Year-specific effect (process error) may render this moot.

Estimating uncertainty (theory)

- ▶ SRS (simple random sample)
 - ▶ $Y_i = \log(CPUE)$.
 - ▶ s is the overall standard deviation.
 - ▶ $SE(\bar{Y}) = s/\sqrt{n}$
- ▶ Stratified SRS
 - ▶ \bar{Y}_h mean in stratum h
 - ▶ s_h standard deviation in stratum h
 - ▶ n_h sample size in stratum h
 - ▶ $SE(\bar{Y}_h) = s_h/\sqrt{n_h}$ SE in stratum h
 - ▶ W_h population level stratum weight
 - ▶
$$\bar{Y}_{overall} = W_1\bar{Y}_1 + W_2\bar{Y}_2 + \dots$$
 - ▶
$$SE(\bar{Y}_{overall}) = \sqrt{W_1^2SE_1^2 + W_2^2SE_2^2 + \dots}$$

Sample allocation

- ▶ Equal allocation: $n_h = n_{total}/H$ where H is number of strata
- ▶ Proportional allocation: $n_h = n_{total} \times W_h$
- ▶ Optimal allocation $n_h = n_{total} \times \frac{W_h S_h}{W_1 S_1 + W_2 S_2 + \dots}$.

Most gains in precision occur moving from Equal to Proportional Allocation; moving to optimal allocation typically leads to smaller improvements

Stratification - Workflow

- ▶ Read and summarize CPUE information. CAUTION. Current FWIS format does not include HUC10 or stream order
- ▶ Find POPULATION WEIGHTS from GIS for each stratification option
- ▶ Estimate s_h for each stratum
- ▶ Do trial allocations, say with $n_{total} = 100$
- ▶ Estimate uncertainty in mean

Is there a benefit from stratification vs. no stratification?

Is there much difference between two types of stratification? Is there much gain moving from Equal -> Proportional -> Optimal?

Exercise: Nordegg River stratification