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# Graphical display of population data

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# Nature of population data

- Hierarchical
- Variable
- Multi-dimensional
- Potentially non-continuous
- Potentially lots of it!



# Scope of the presentation

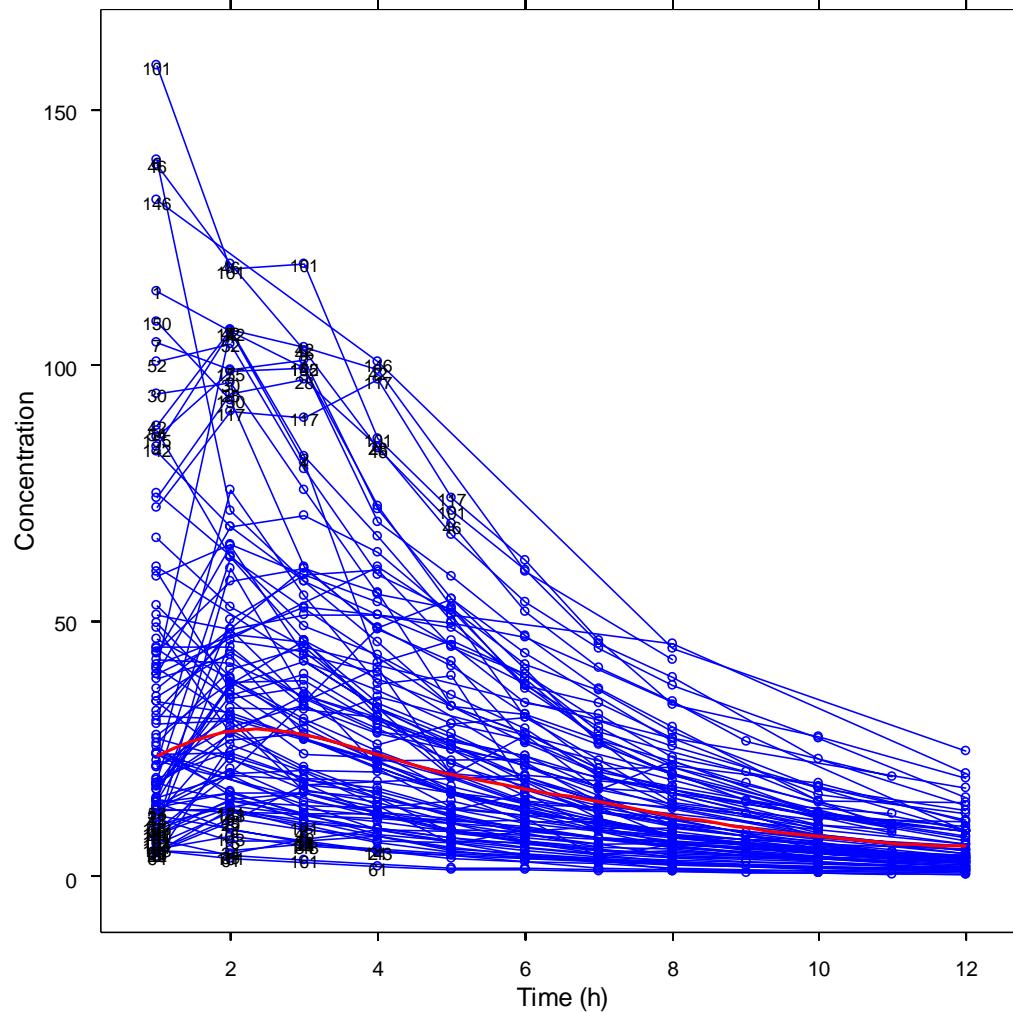
1. Basic graphical techniques for continuous population data
2. Graphical techniques for ordered categorical data



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# Spaghetti plots

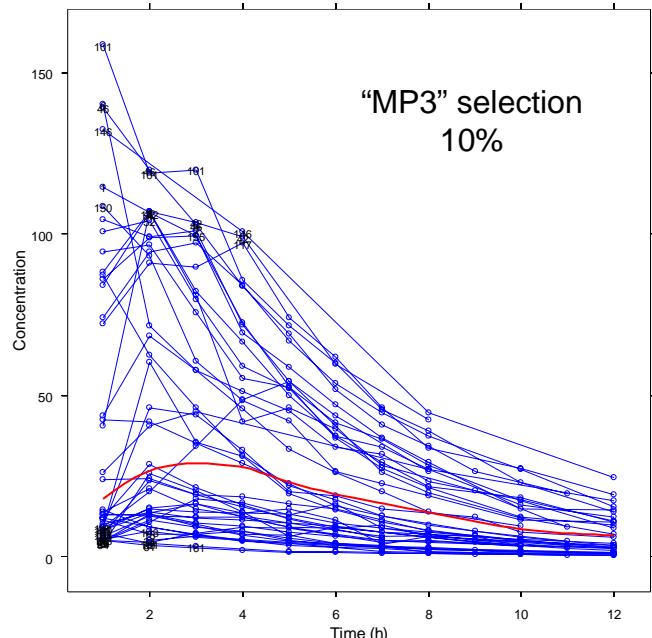
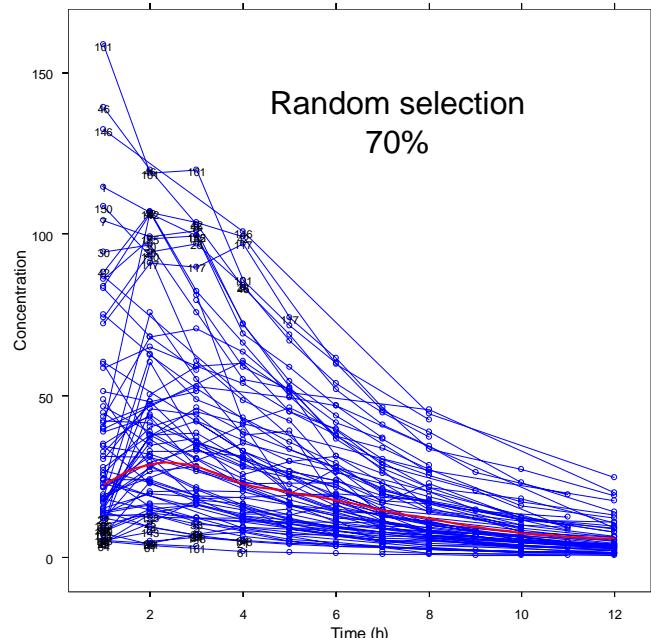
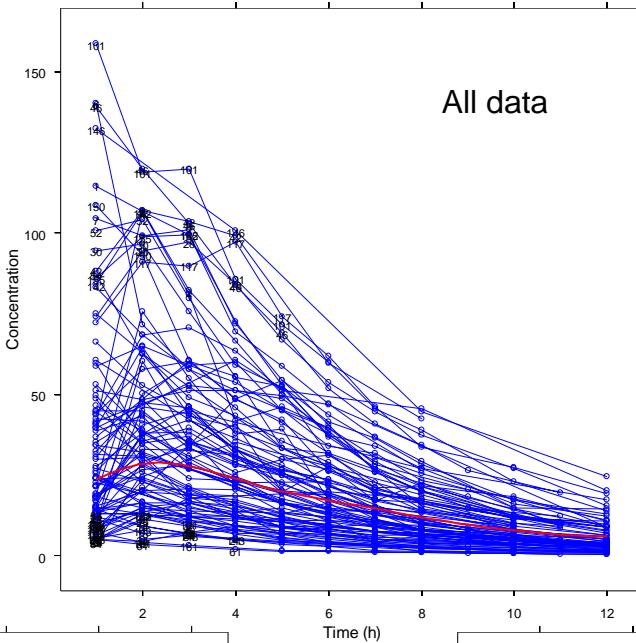
## Hierarchy and variability





# Data dilution

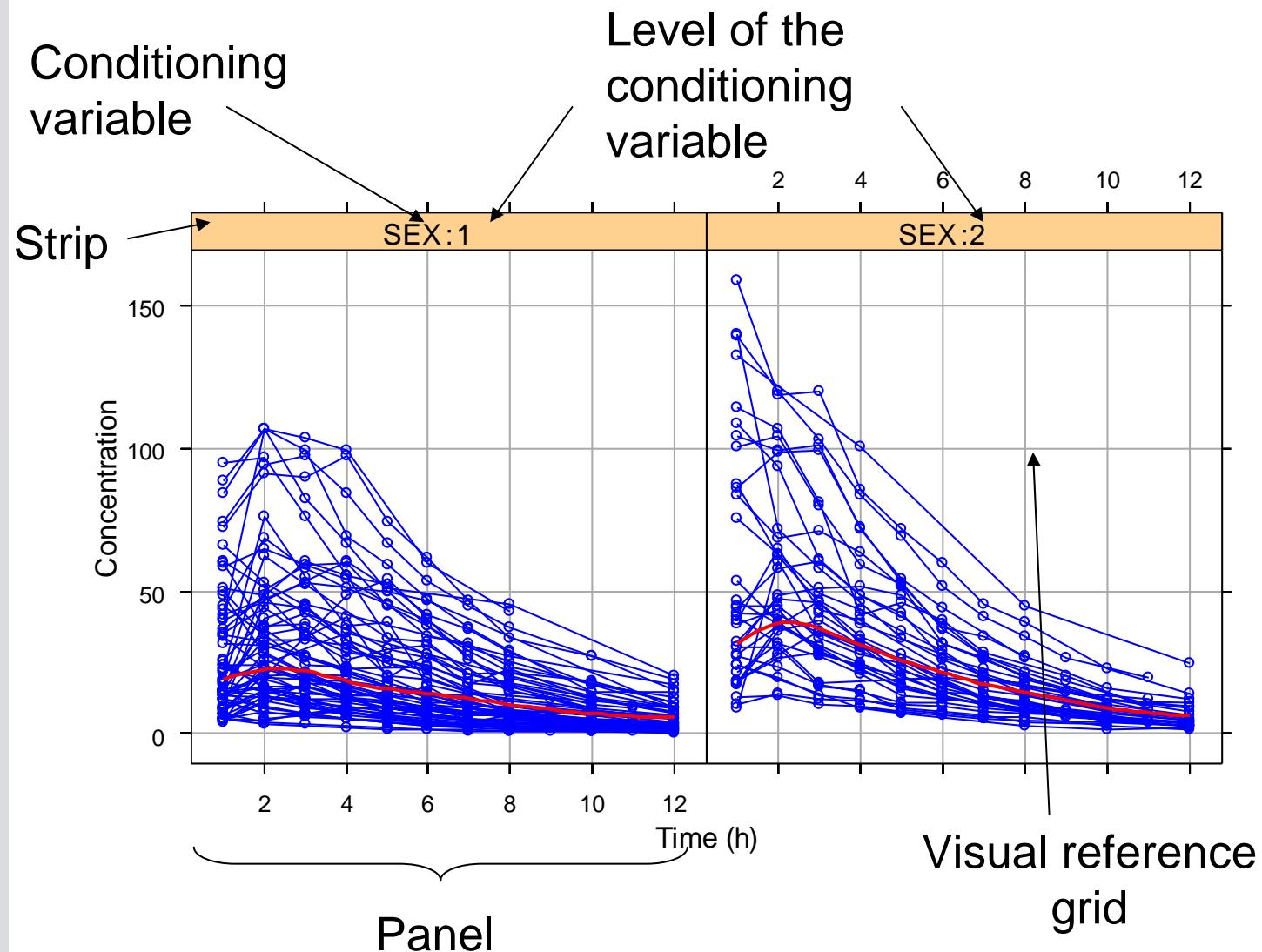
## Multitude





# Multi-panel conditioning

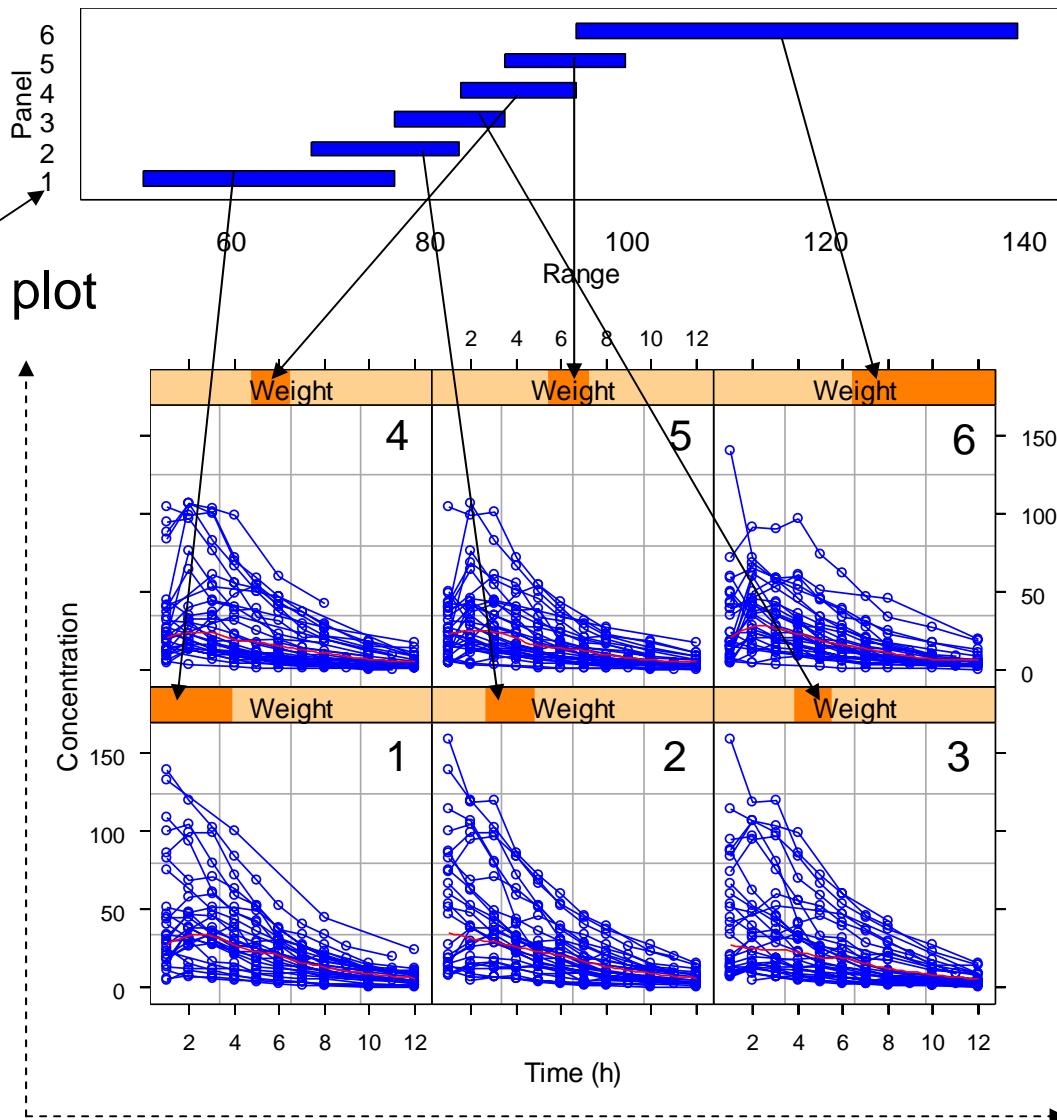
## Dimensionality





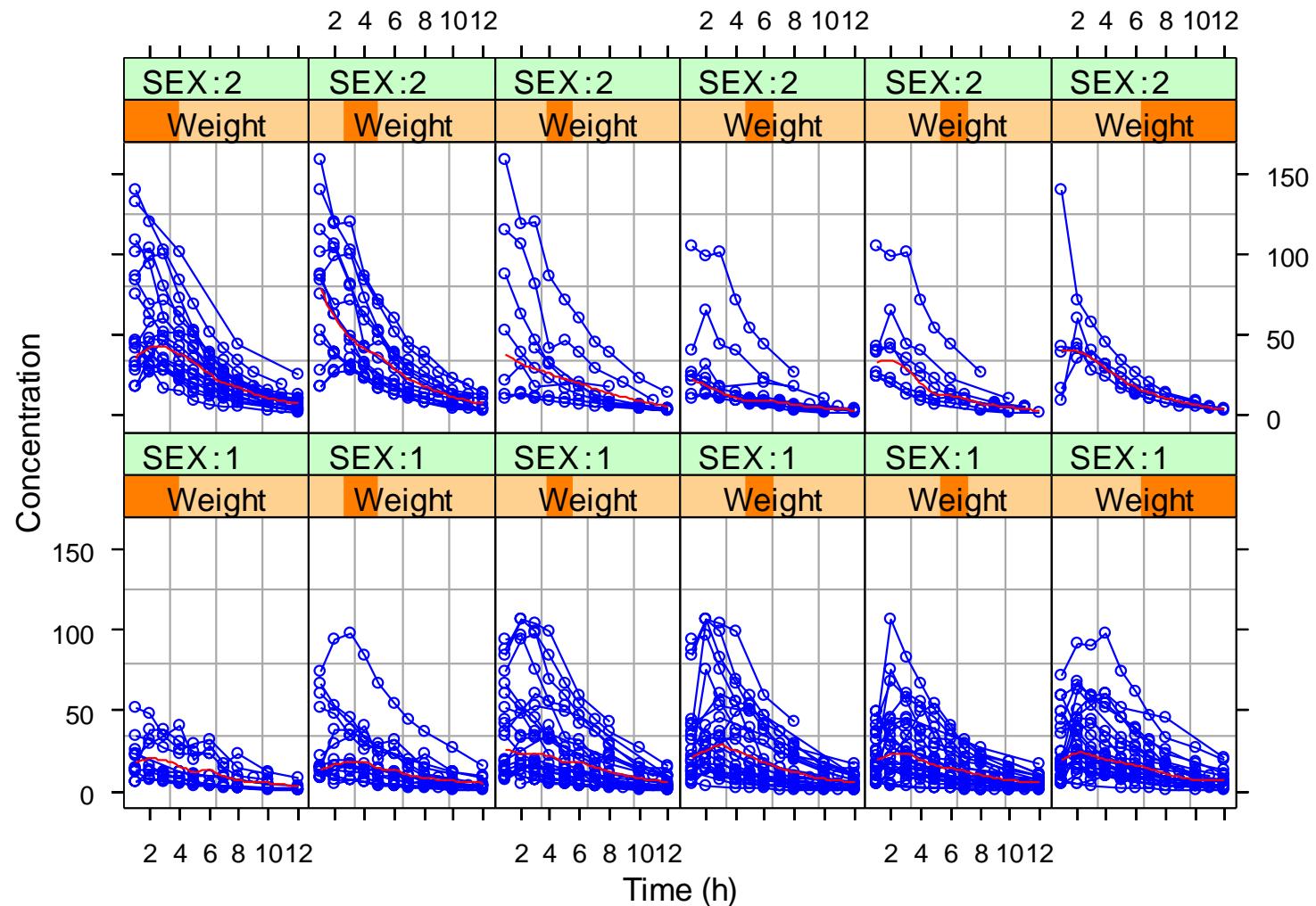
# Continuous conditioning variable

## Shingle plot



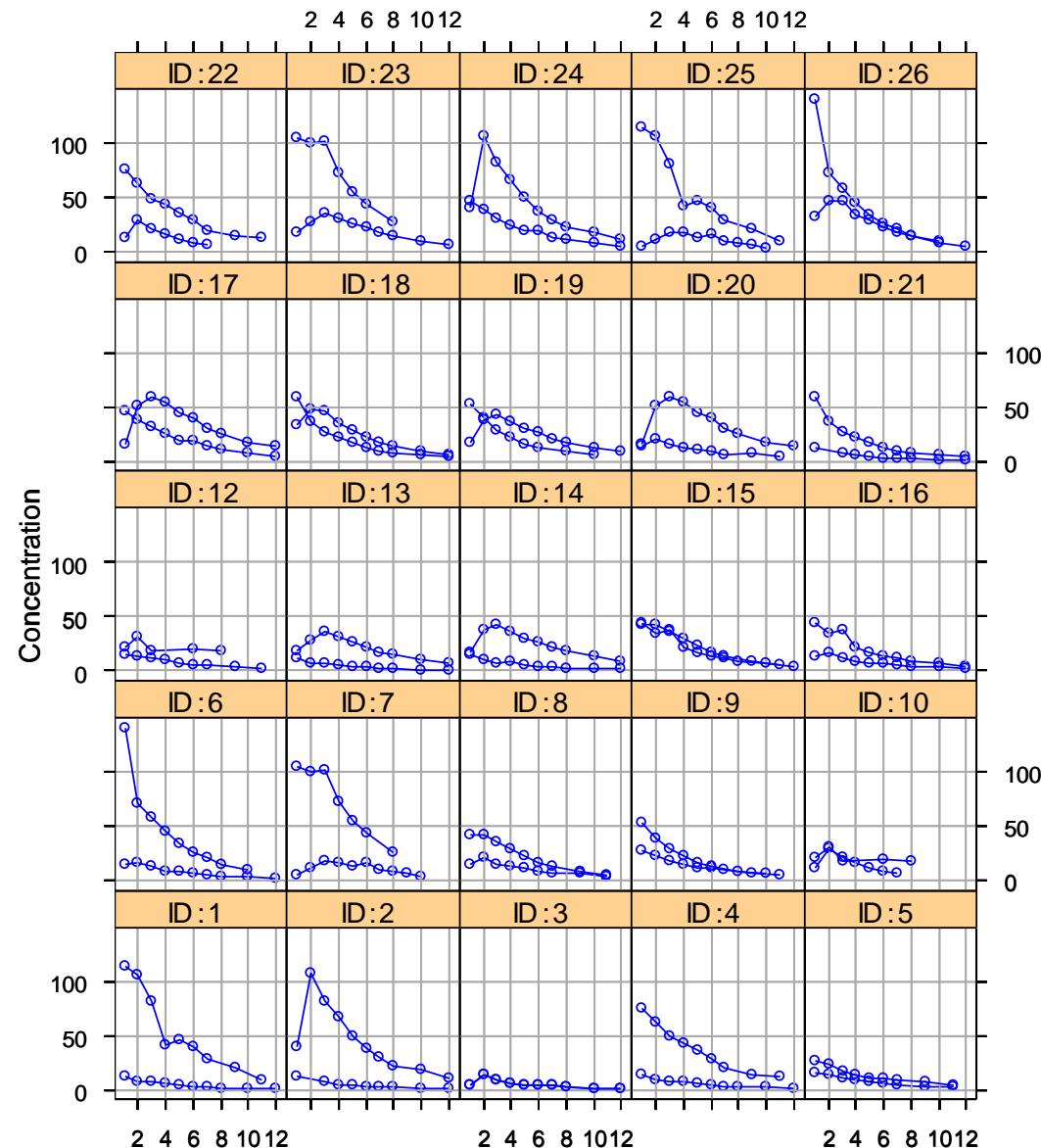


# Multiple conditioning variables





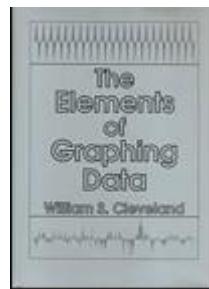
# Main effects ordering



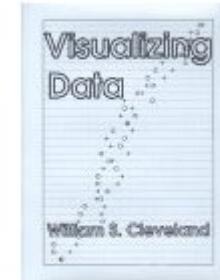


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# Further reading



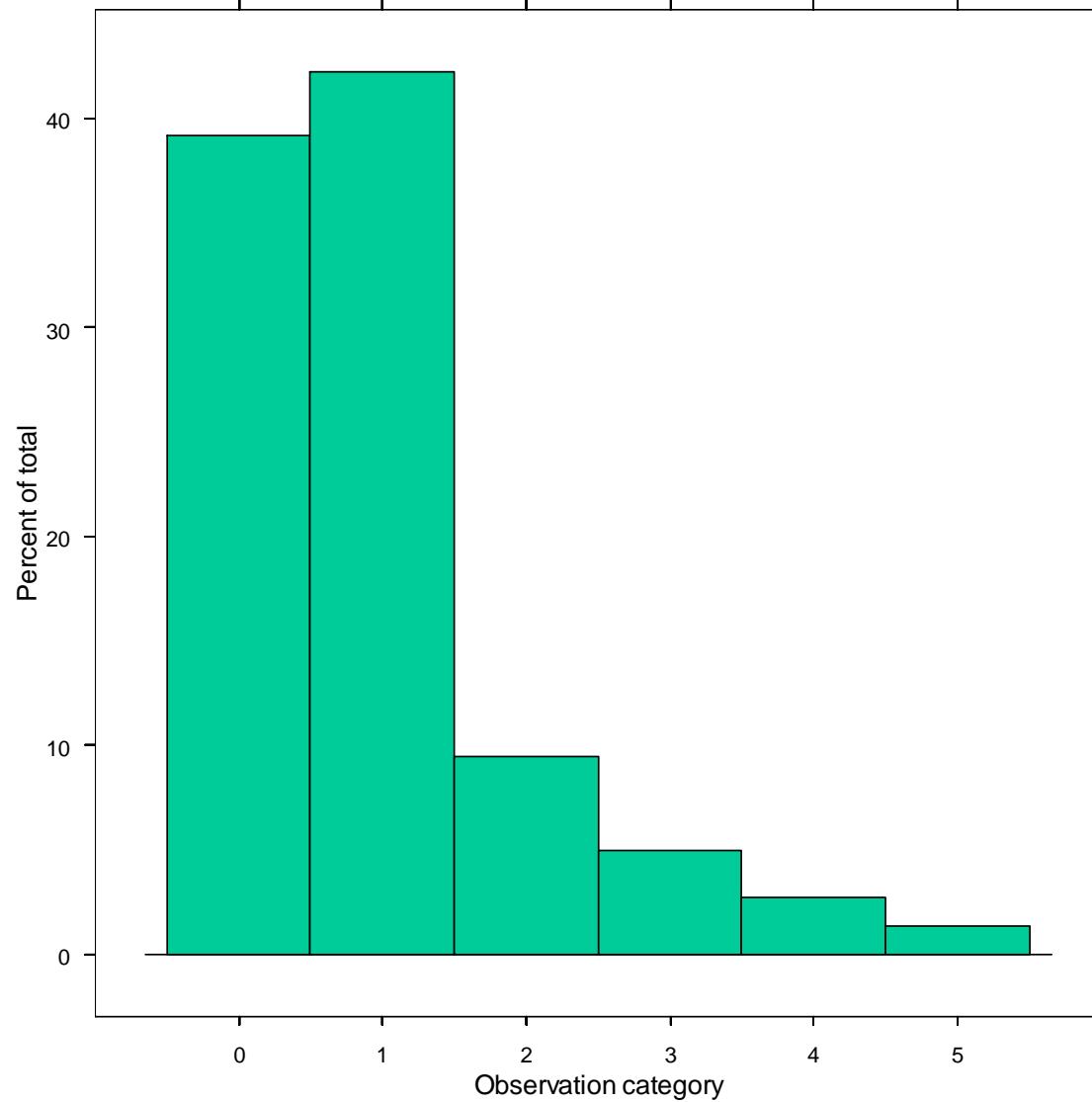
The elements of graphing data  
William S. Cleveland



Visualizing data  
William S. Cleveland

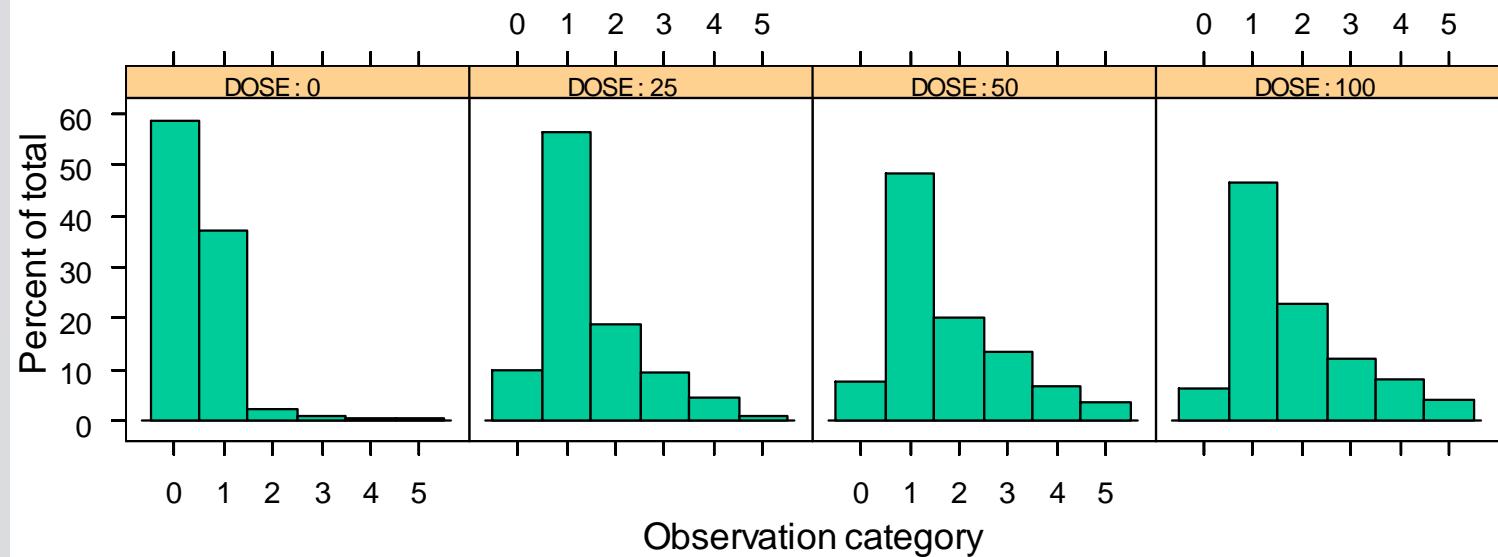


# Ordered categorical data



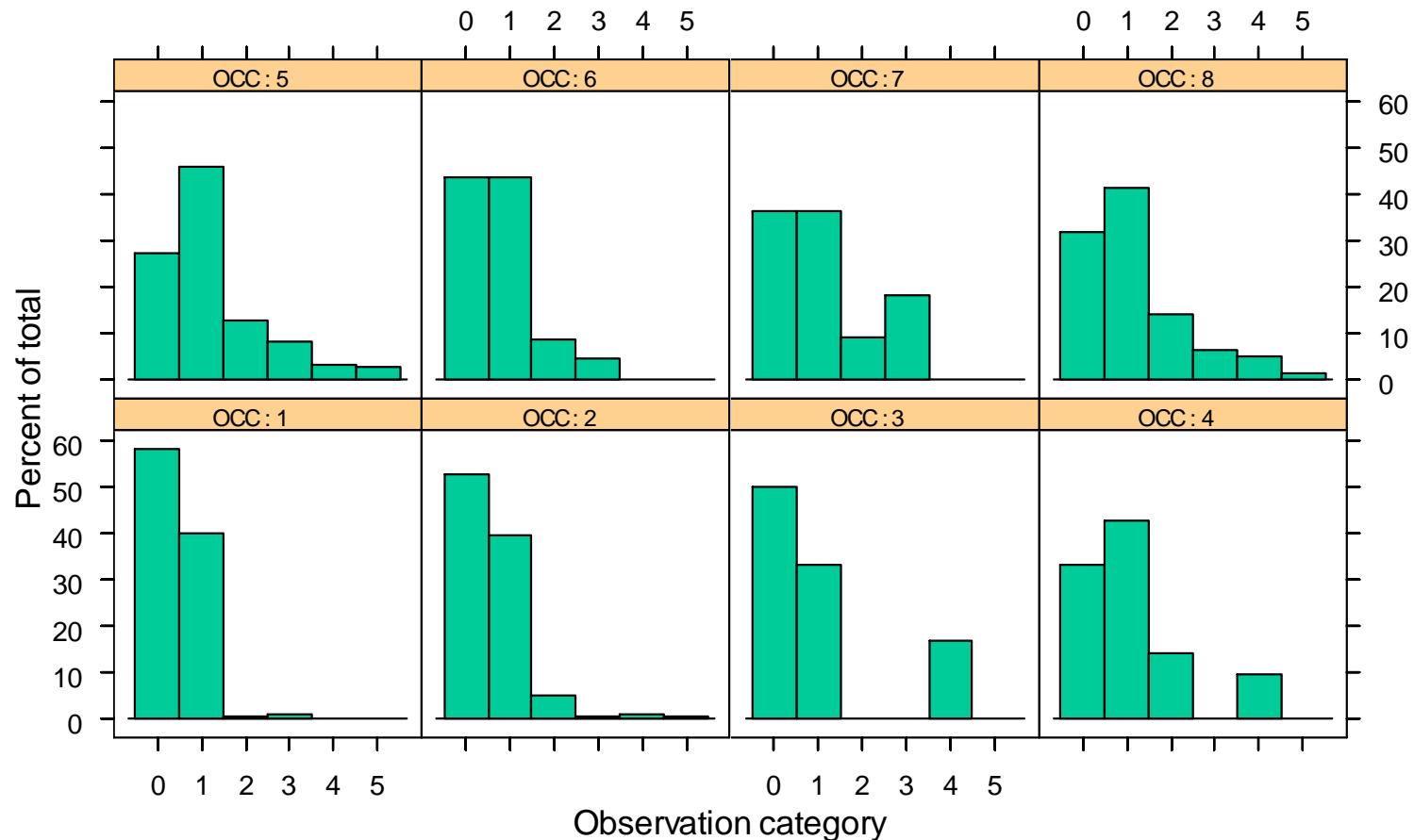


# Taking one predictor into account...



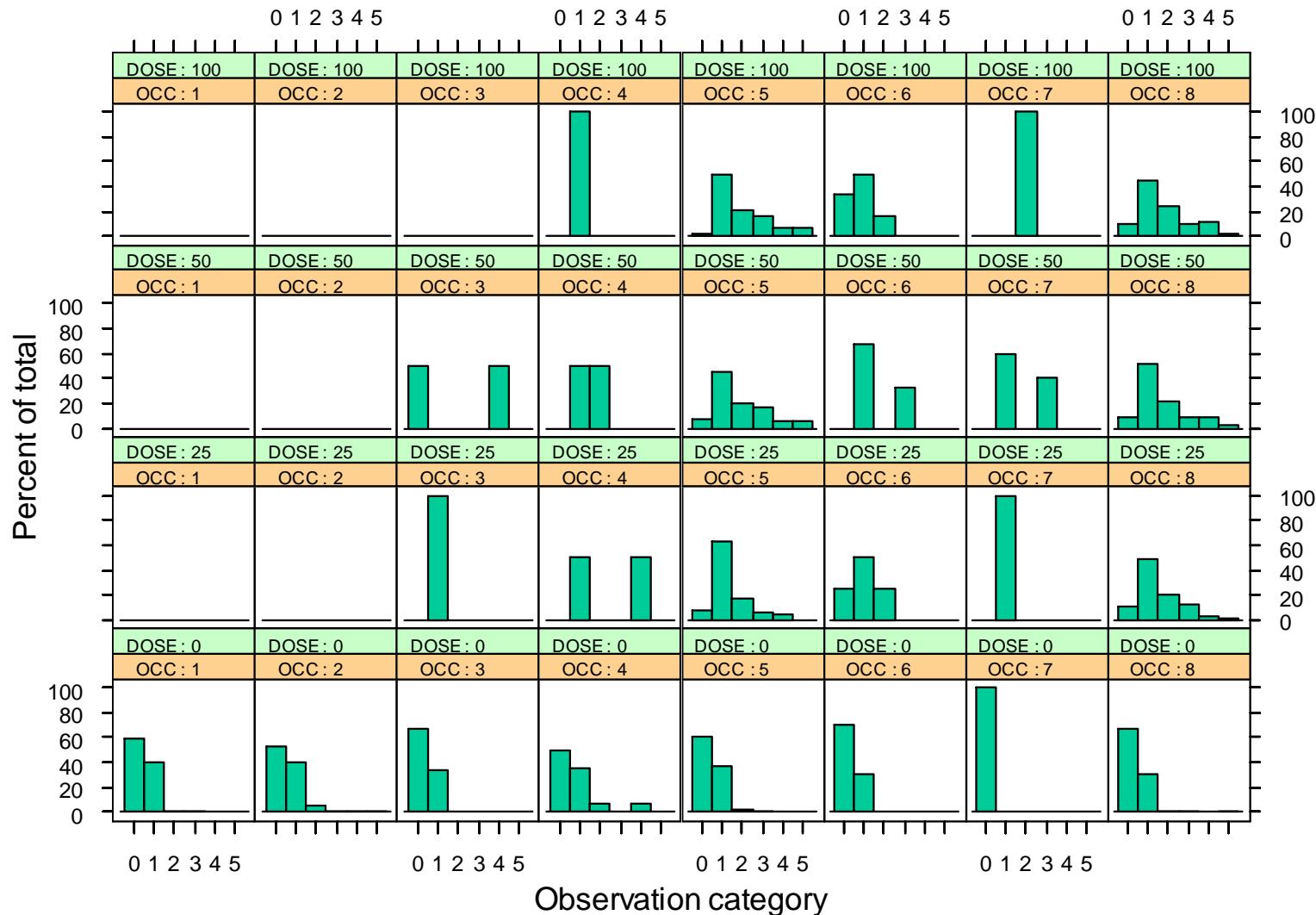


# Taking another predictor into account...



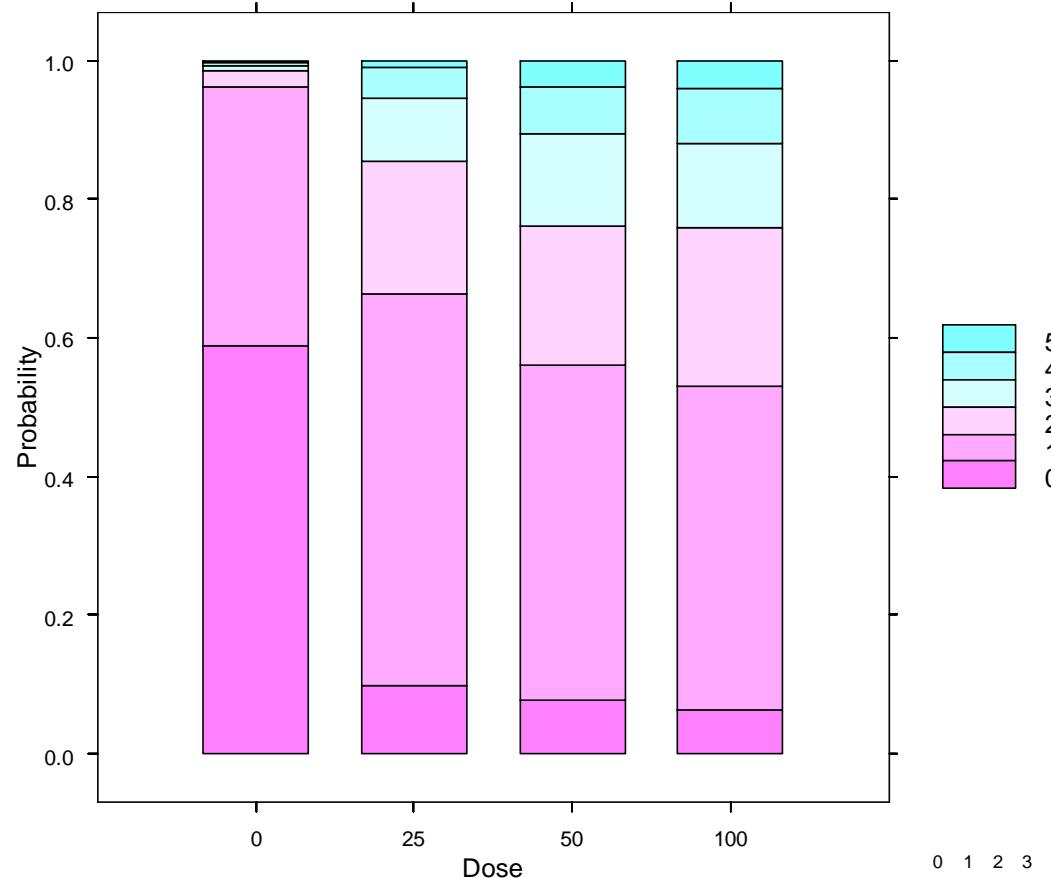


# Both Dose and Occasion

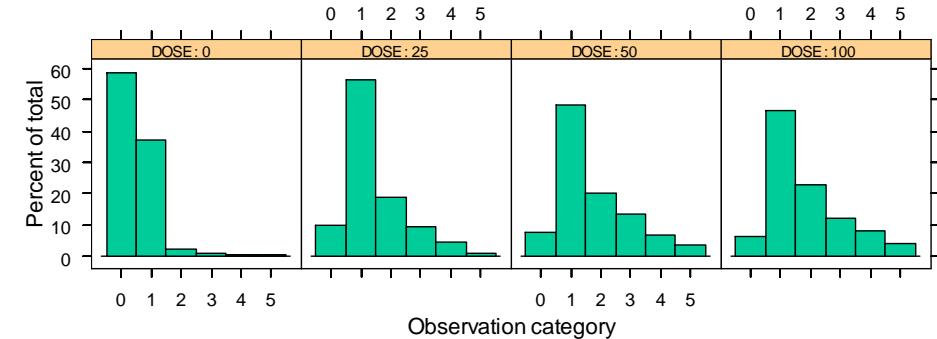




# Stacked bar graphs

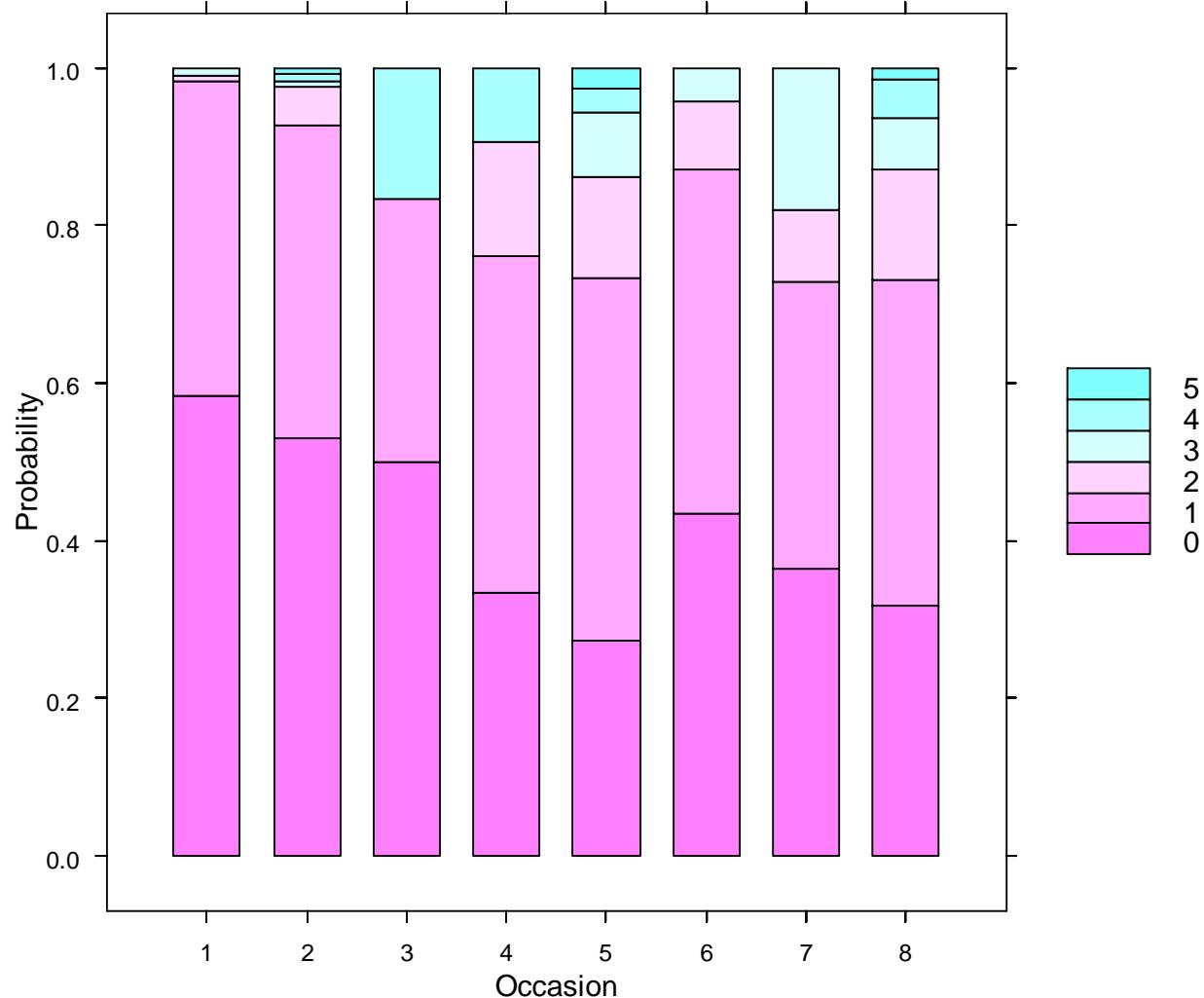


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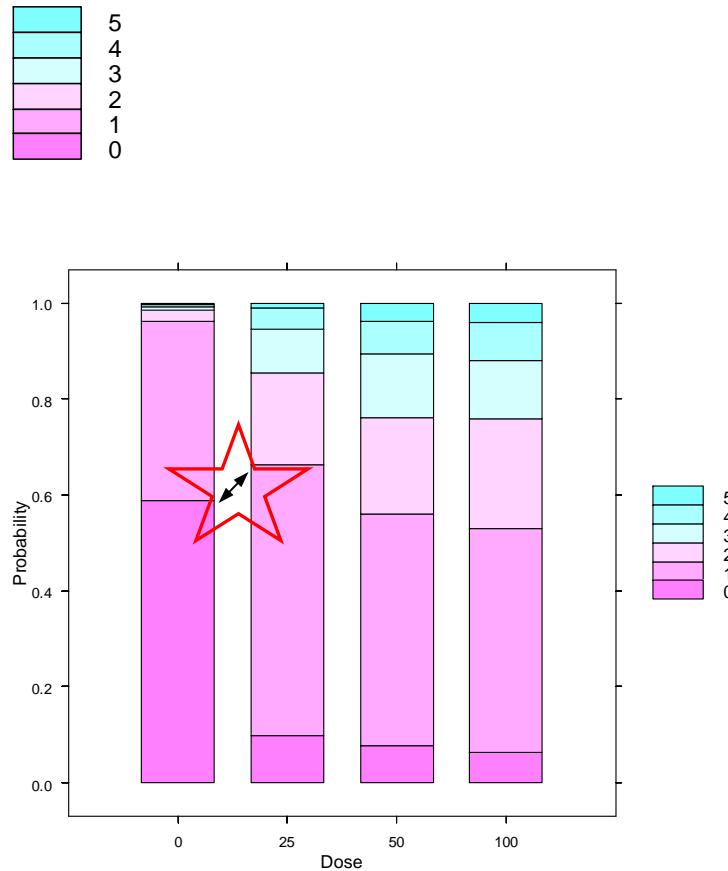
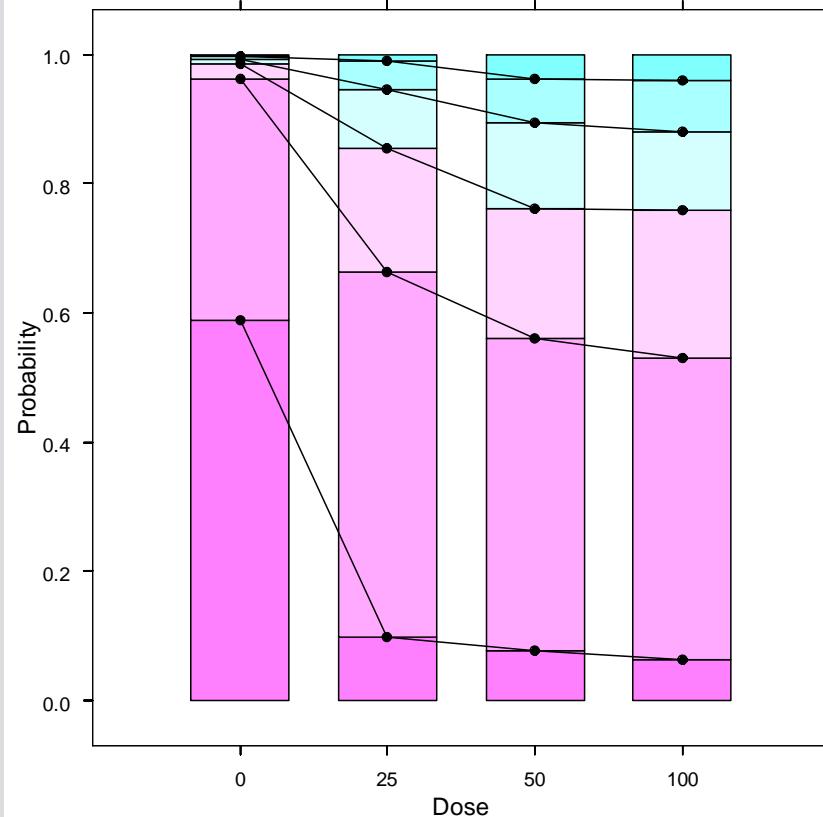


# The same for Occasion...



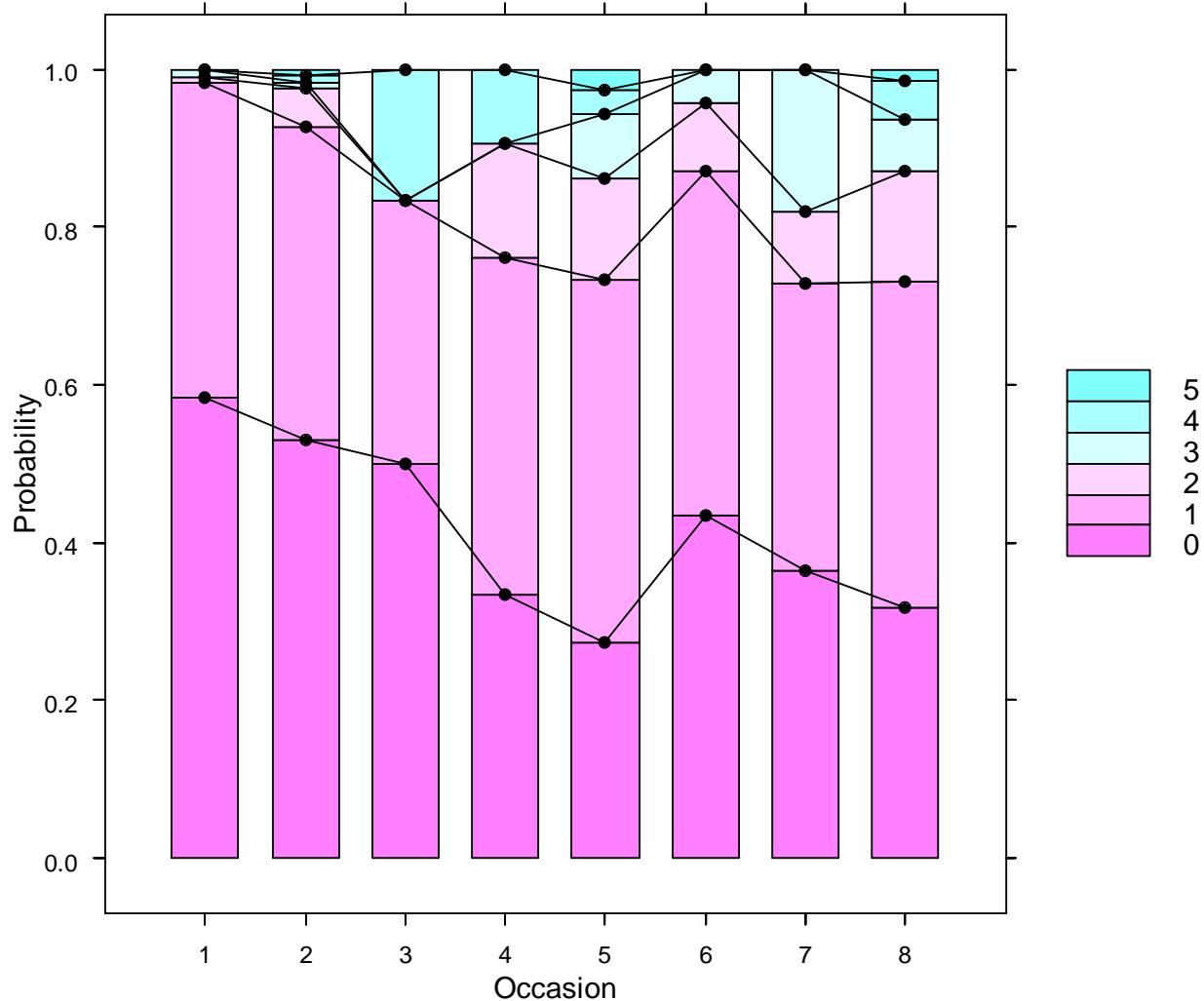


# Visualizing the cumulative probabilities – by Dose



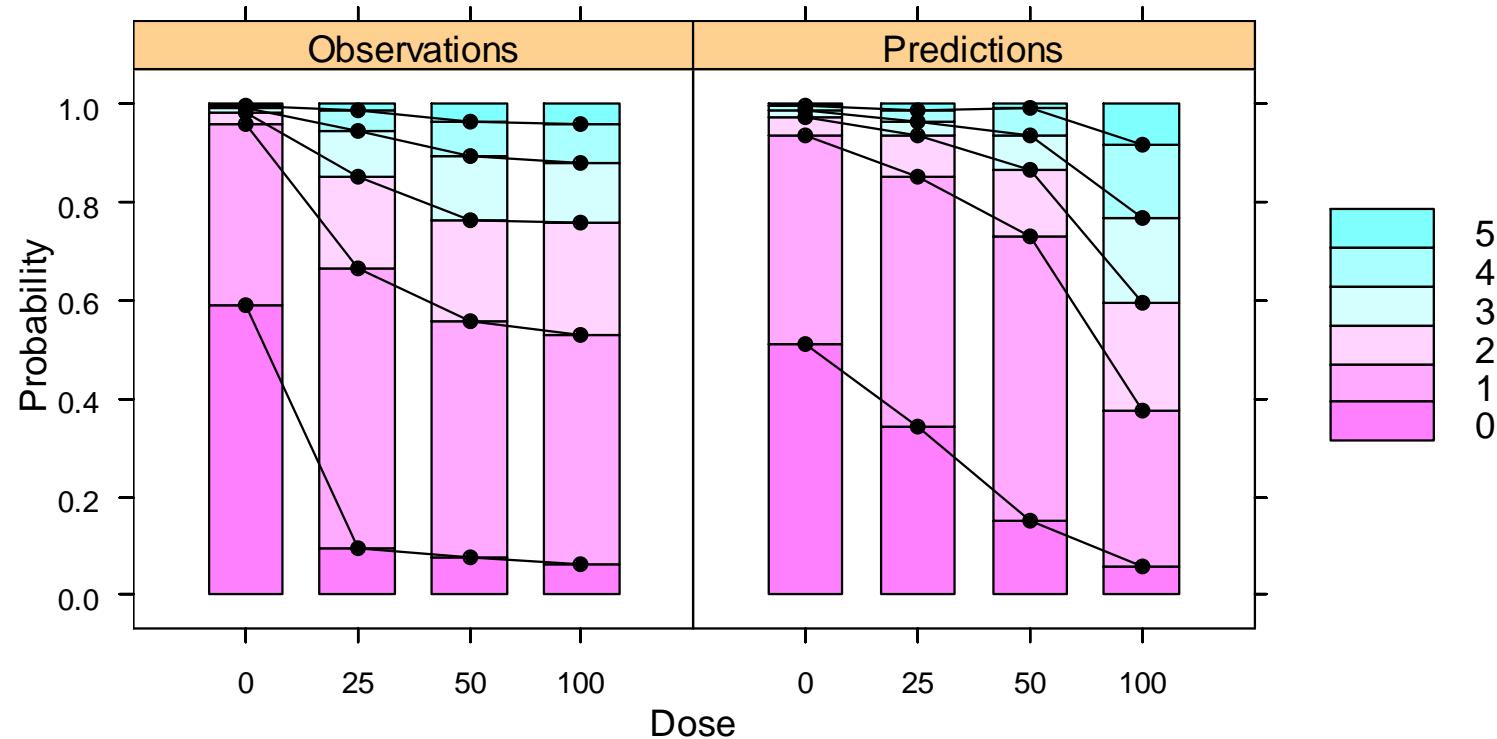


# Visualizing the cumulative probabilities – by Occasion



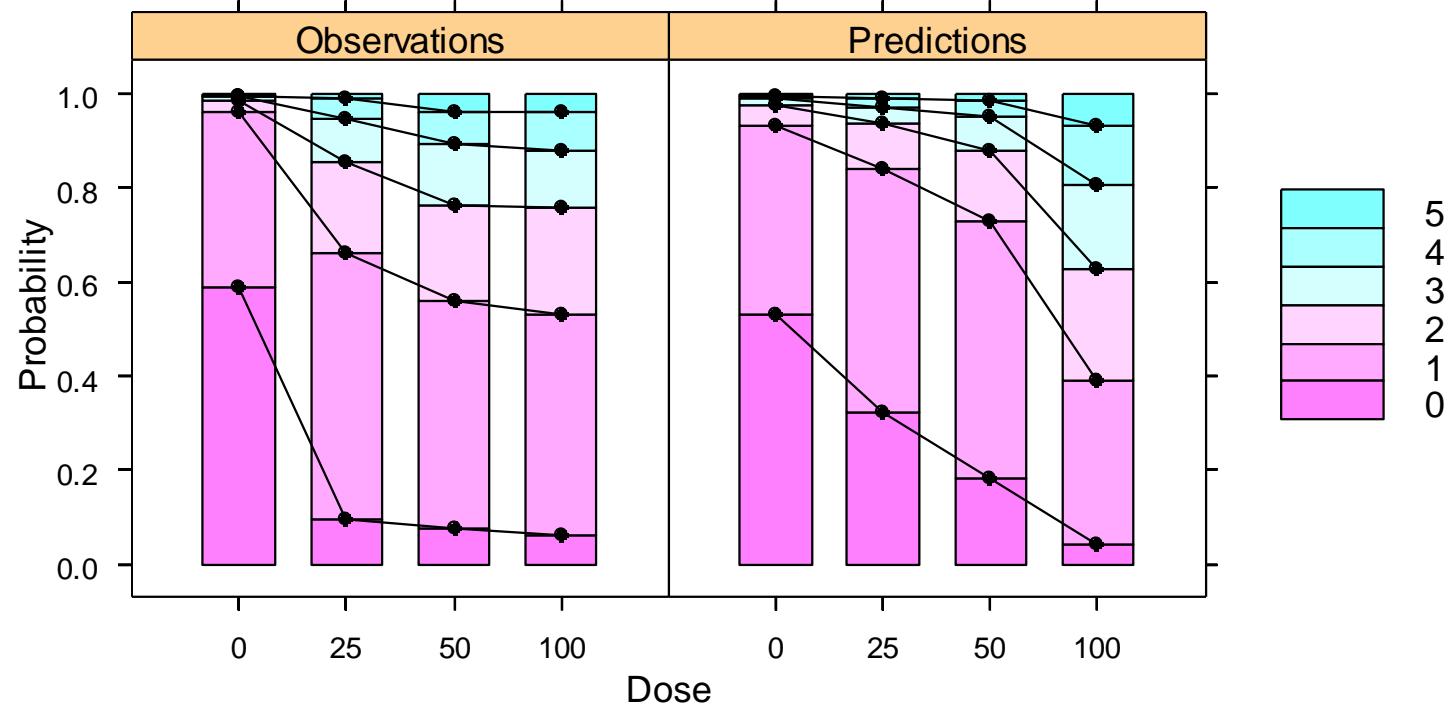


# Model diagnostics – linear logit model



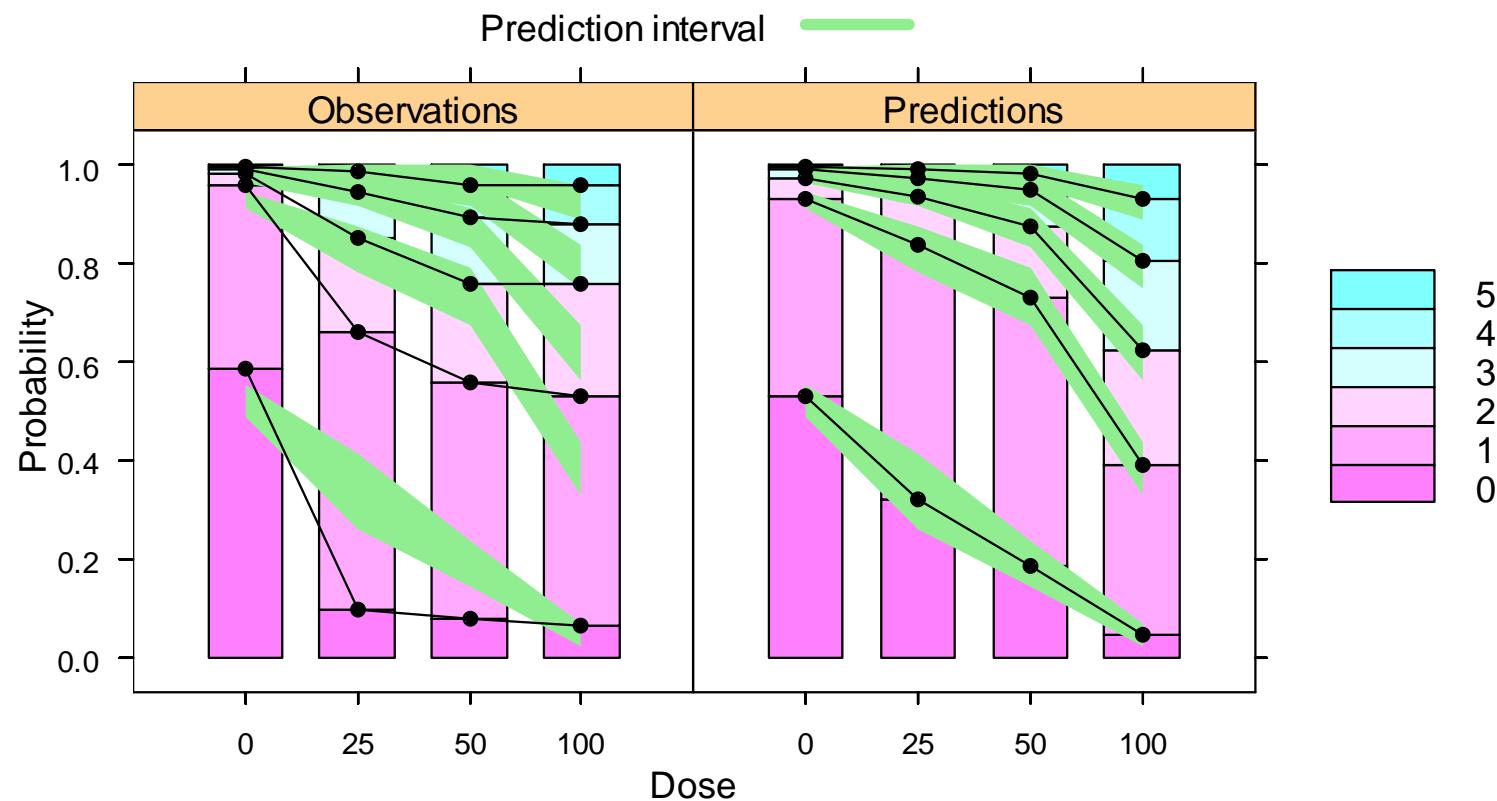


# Using expected probabilities



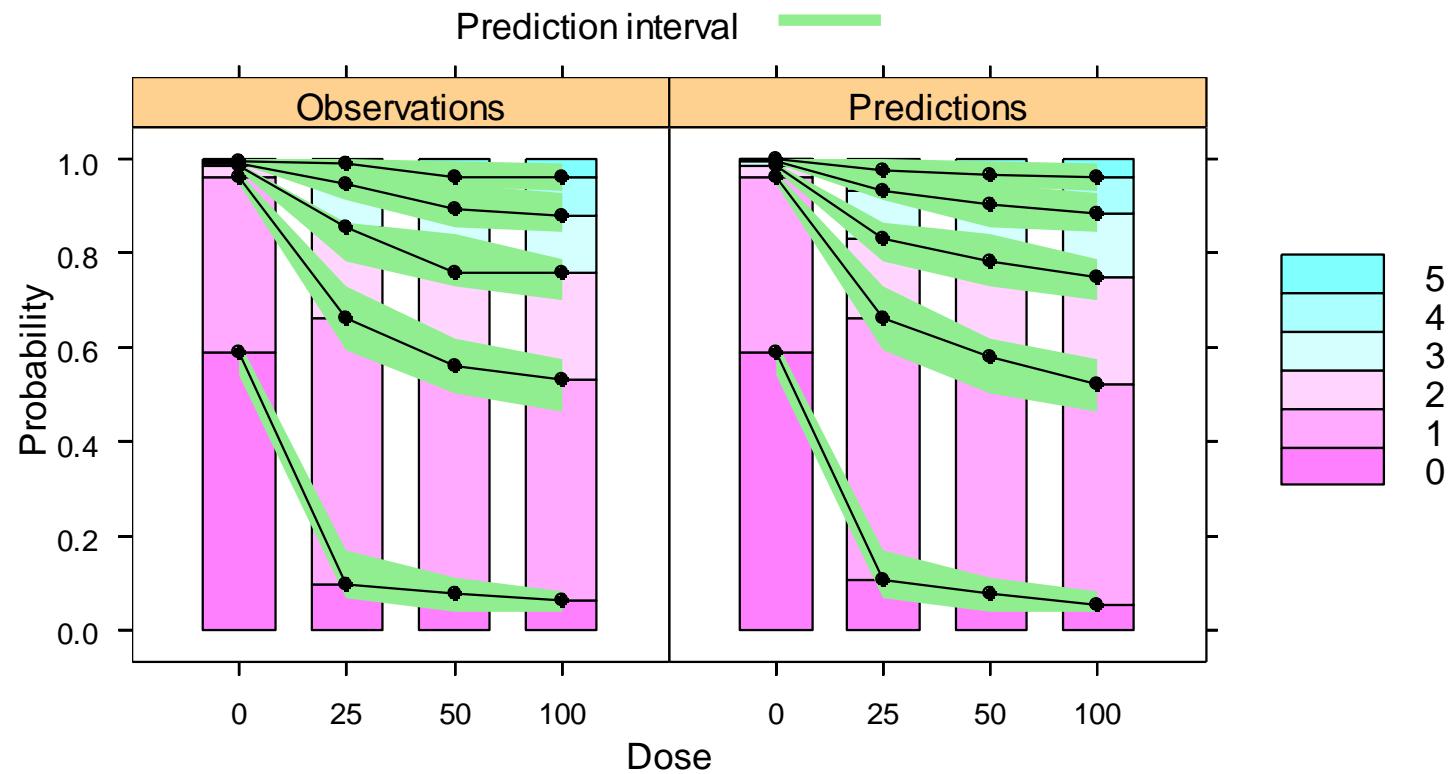


# The uncertainty in the predicted probabilities



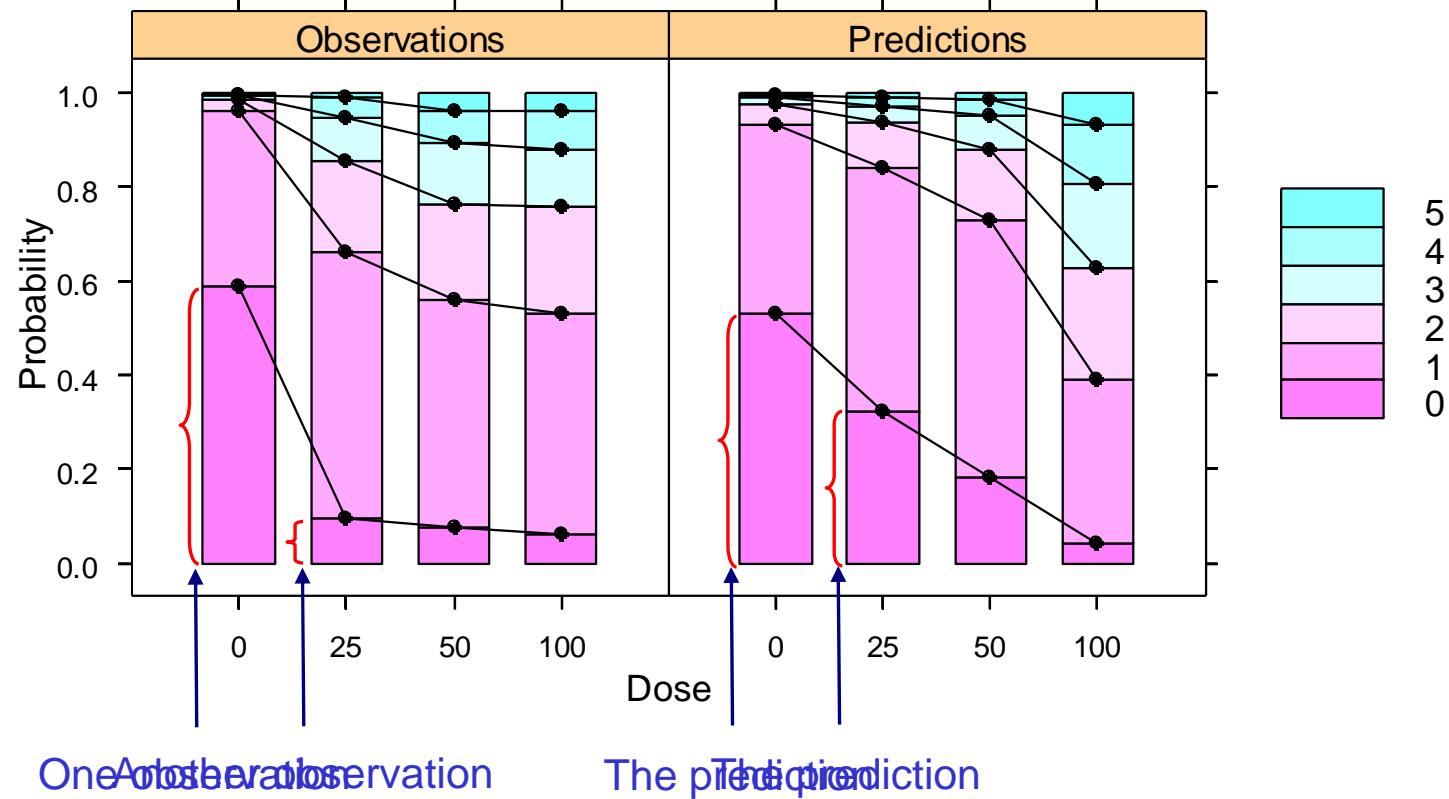


# Changing the model – an Emax logit model



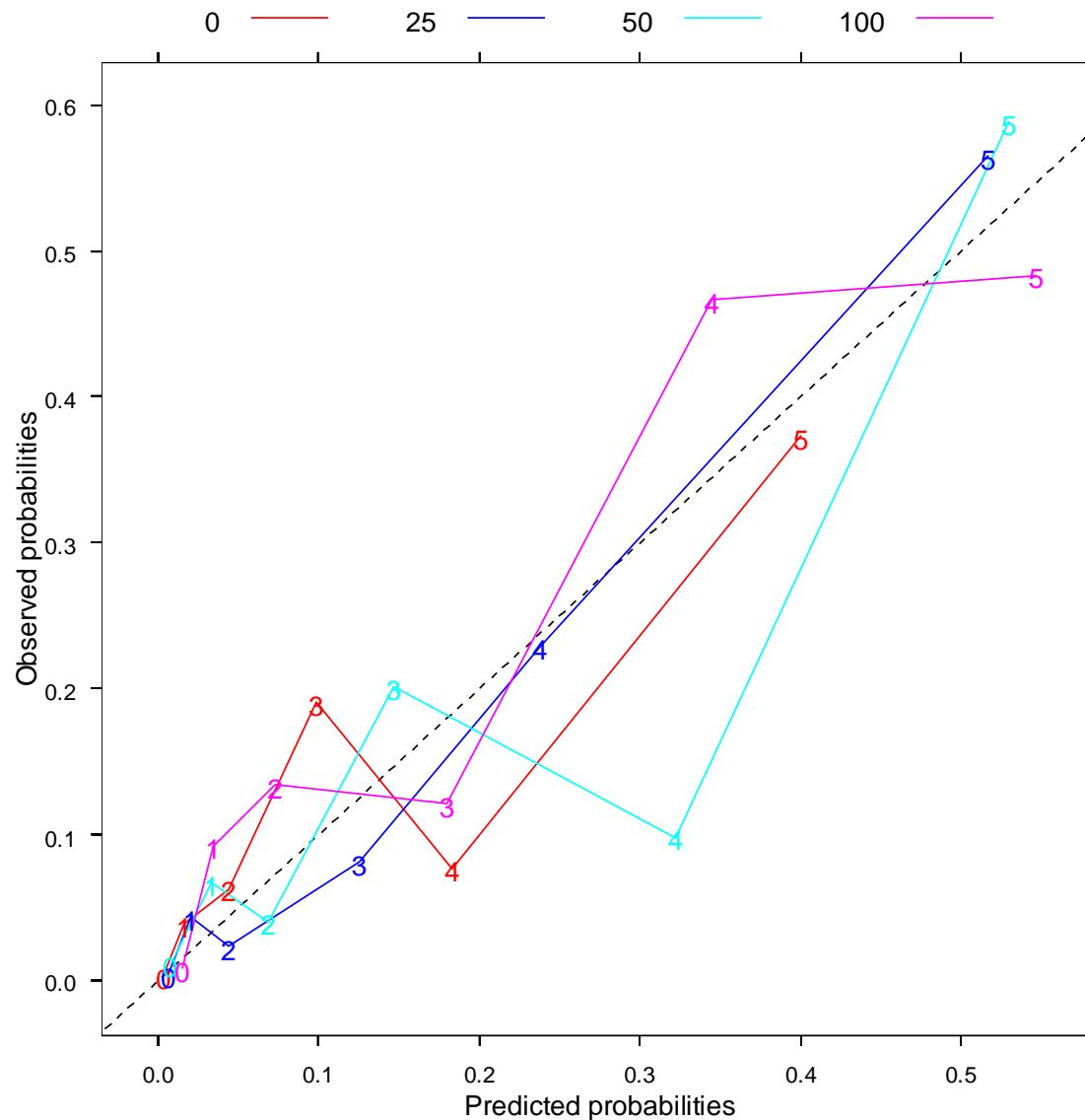


# Comparing observations and predictions in a continuous manner





# Observed vs predicted – linear logit model





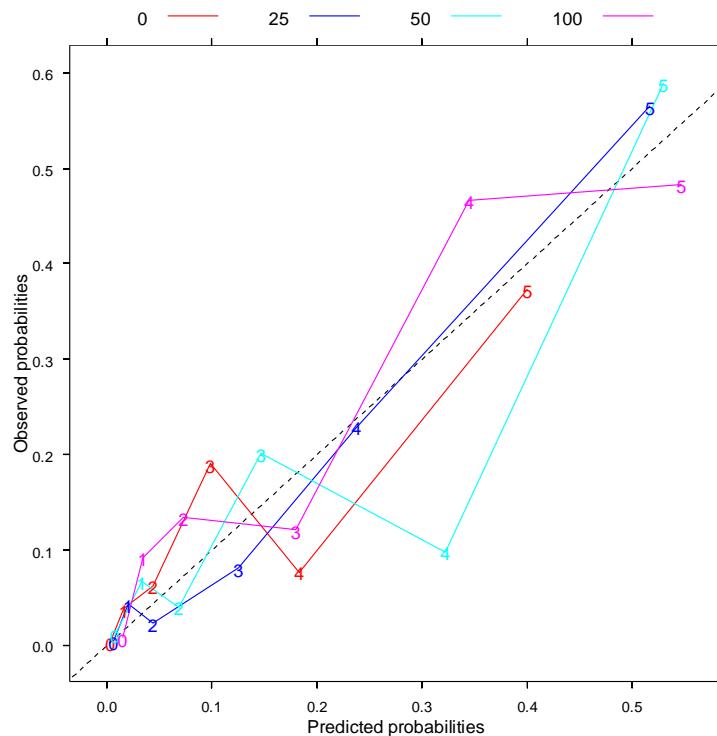
# Simulations for checking goodness of fit graphs

1. Fit the model to the observed data.
2. Create the goodness of fit graph.
3. Simulate a new data set under the model from 1.
4. Fit the model from 1 to the simulated data.
5. Create the goodness of fit graph based on the fit to the simulated data.
6. Compare the graphs 2 and 5, using 5 as a reference.

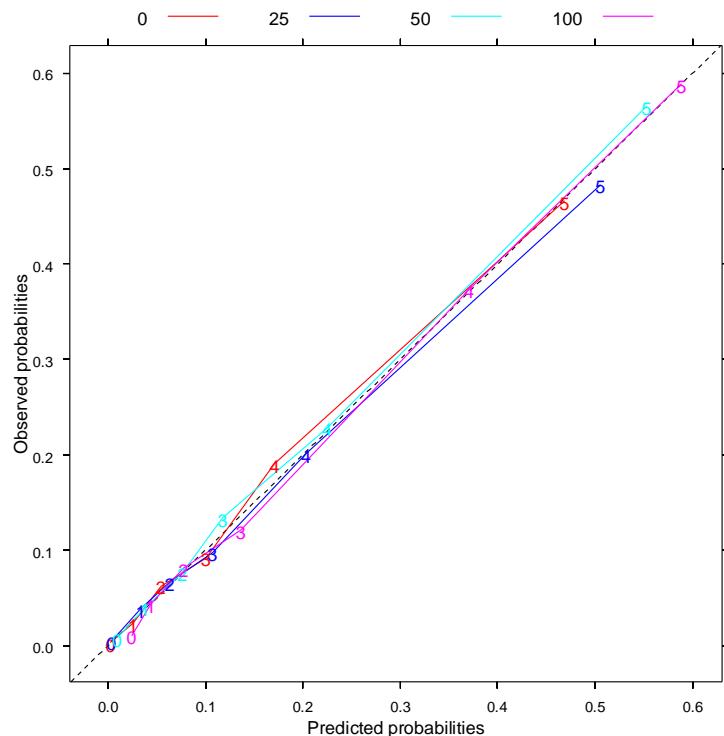


# Using the simulated goodness of fit graph as reference

Based on the original data

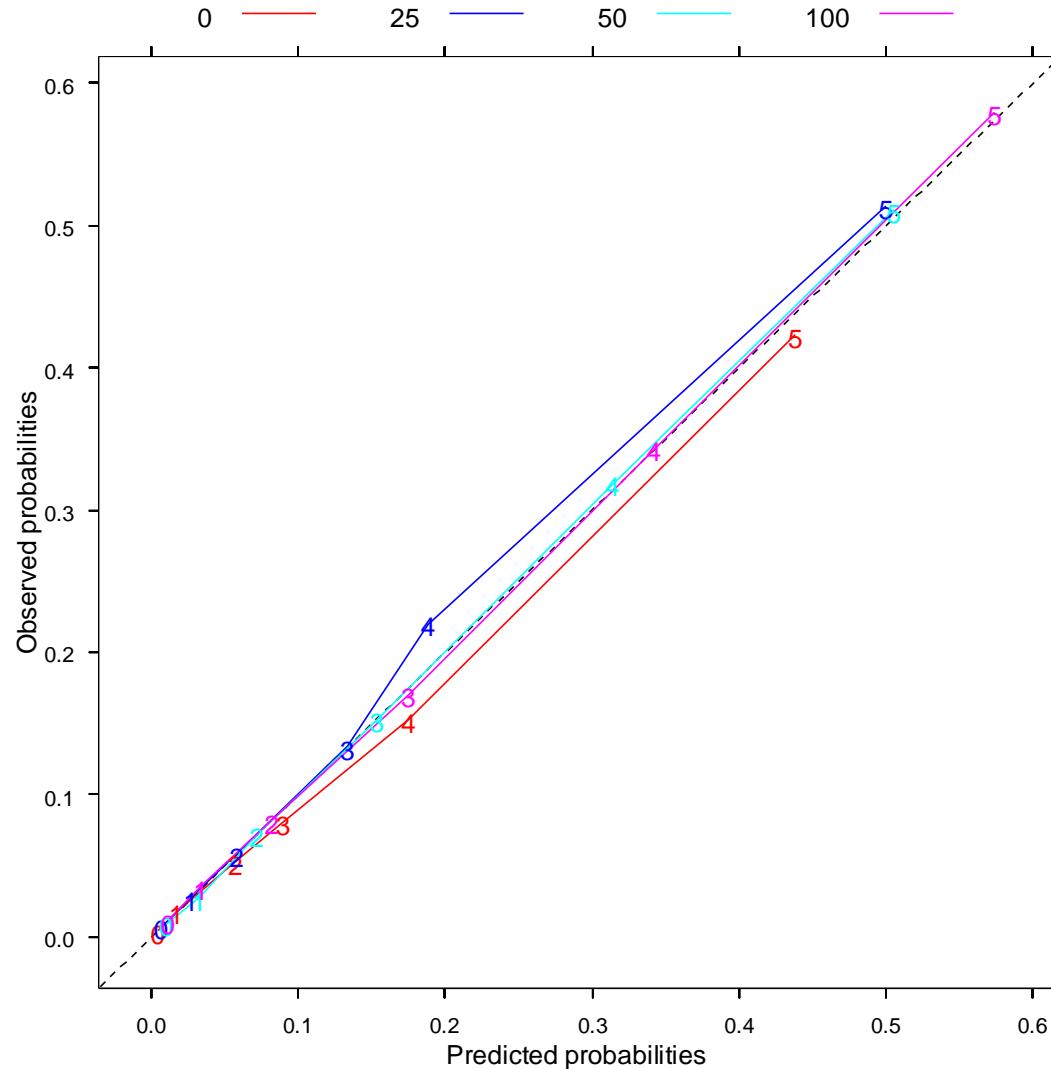


Based on simulated data





# The Emax logit model





# Summary

- There are graphical techniques that handles the hierarchical, variable and multitude of population data.
- Multi-panel conditioning is a powerful way of visualizing high dimension data.
- Ordered categorical data can be visualized and diagnosed by viewing the data as probabilities.
- Simulations can be a useful tool when evaluating goodness of fit graphs.