



# Step Up Your Statistical Practice with Today's SAS/STAT<sup>®</sup> Software

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SAS Institute Technical Support

## Are you over-relying on familiar procedures, and unaware of newer procedures that could benefit your work?

Should you *always* use

- PROC REG for building predictive models?
- PROC GENMOD for handling dropouts in longitudinal studies?
- PROC LIFETEST for analyzing interval-censored data?
- PROC MIXED for fitting linear mixed models?

## **This presentation explains the advantages of newer tools in four of the many areas where SAS/STAT is expanding**

1. Regression model building
2. Inferential analysis of generalized linear models
3. Survival analysis
4. Analysis of mixed models

**This is a high-level overview, which gives you the big picture without descending into details**



SAS® users on balloon safari at Magaliesburg, South Africa, November 2015

# Regression Model Building



# Tech Support is often asked, “Can you add a CLASS statement to PROC REG?”



Kathleen Kiernan  
Analytical Technical Support

# **PROC GLMSELECT is now the flagship procedure for building standard regression models**

## **Designed for**

- Selecting the “best” model when you are choosing from hundreds of variables—or even thousands
- Continuous or categorical predictors
- Explanatory models or predictive models

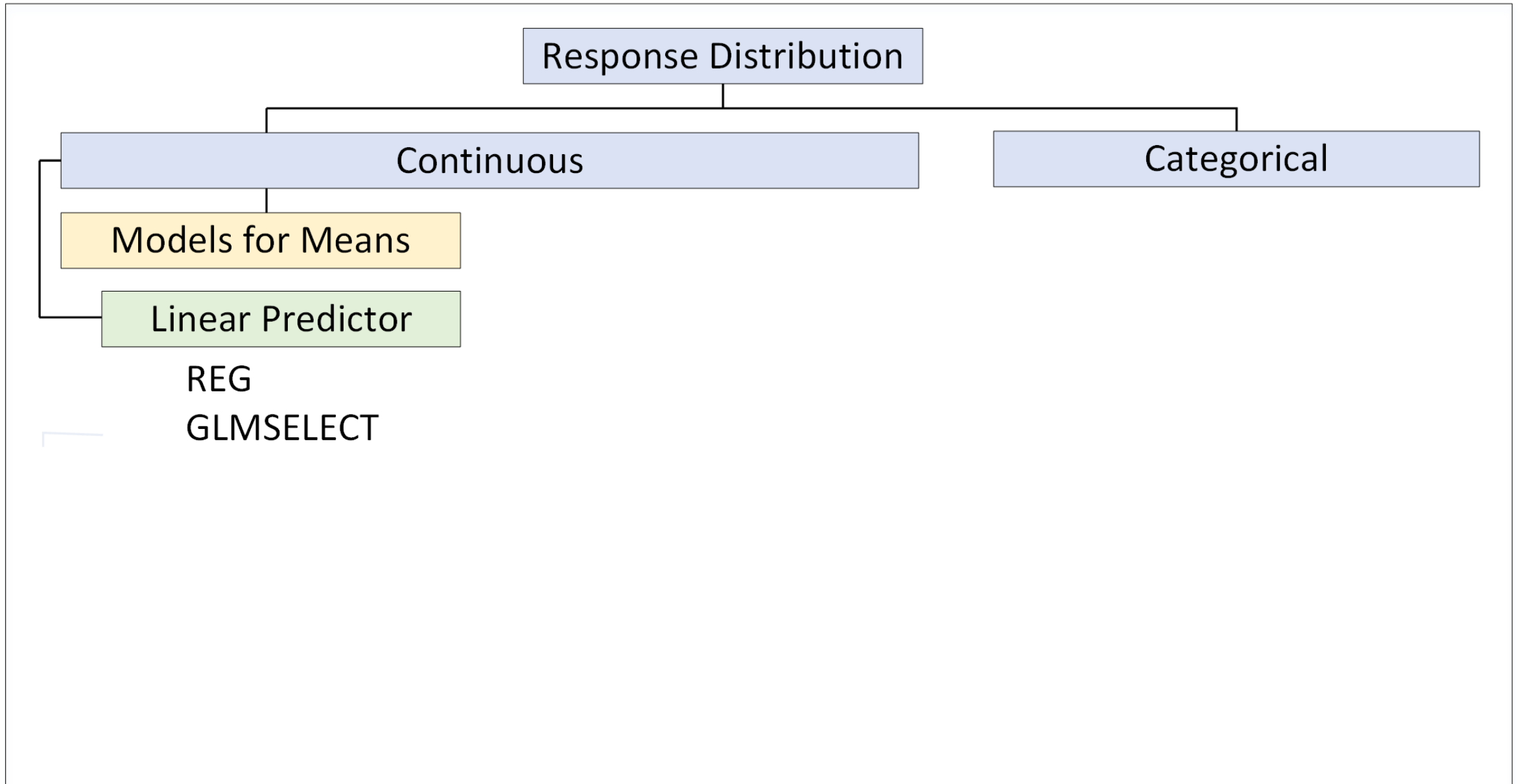
## PROC GLMSELECT provides many advantages for building regression models with large data

- Effect selection methods for general linear models
  - Predictors can be main effects of continuous or classification variables, and interaction effects
- Lasso methods for sparse, more interpretable models
- Data partitioning to avoid overfitting

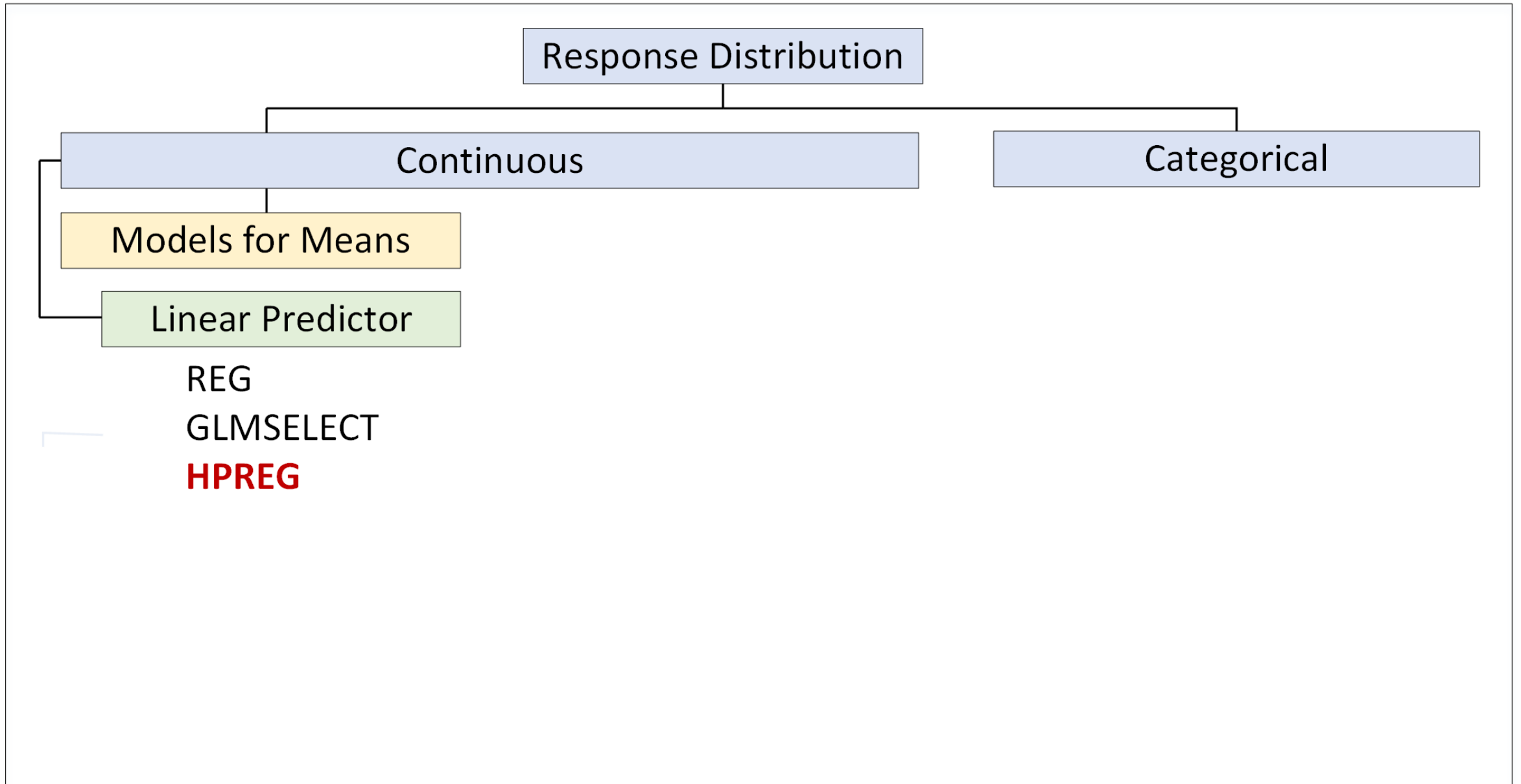
Use PROC REG for fitting regression models when you need inferential methods, influence statistics, and diagnostics



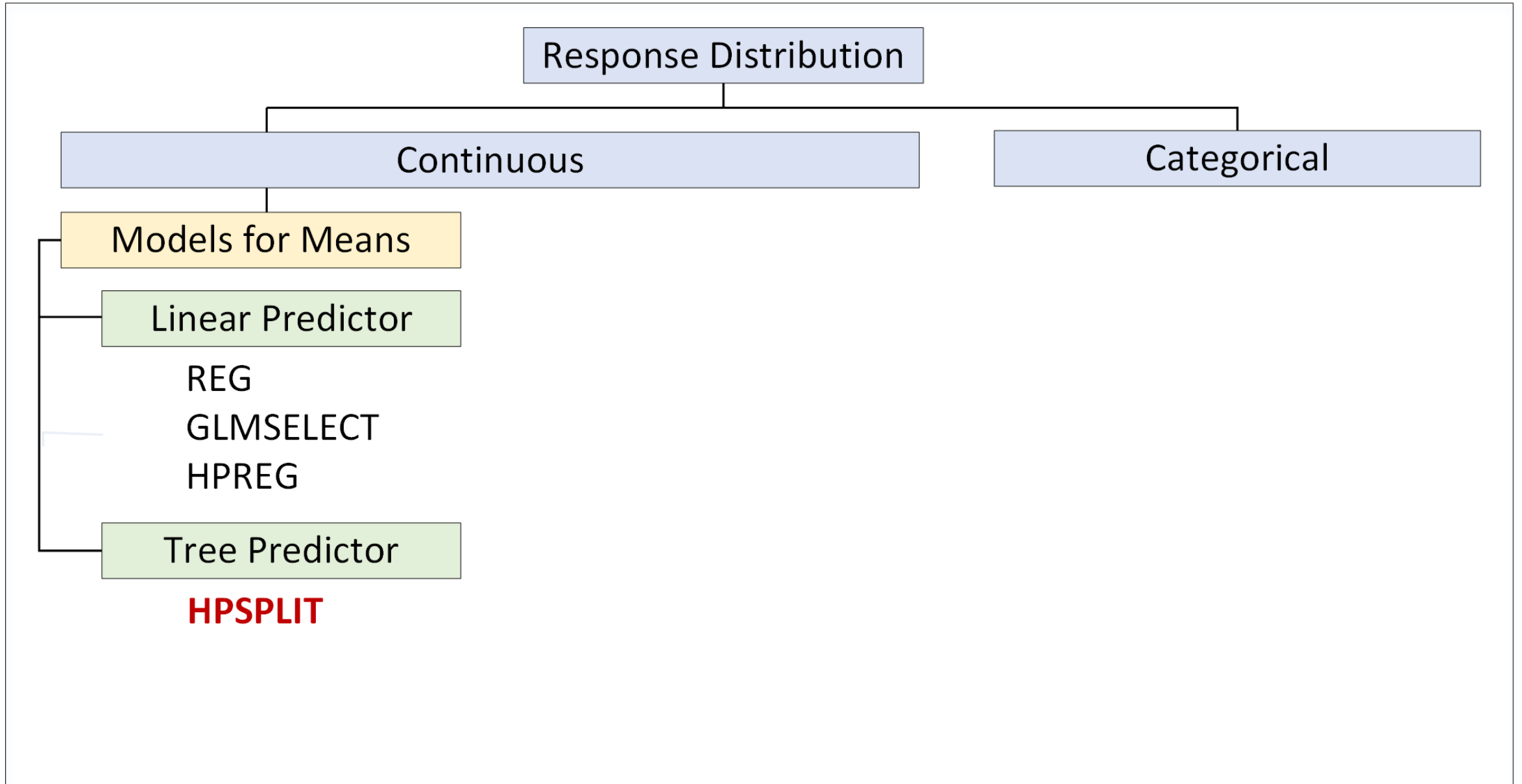
# Model building procedures are available for a variety of goals and methods



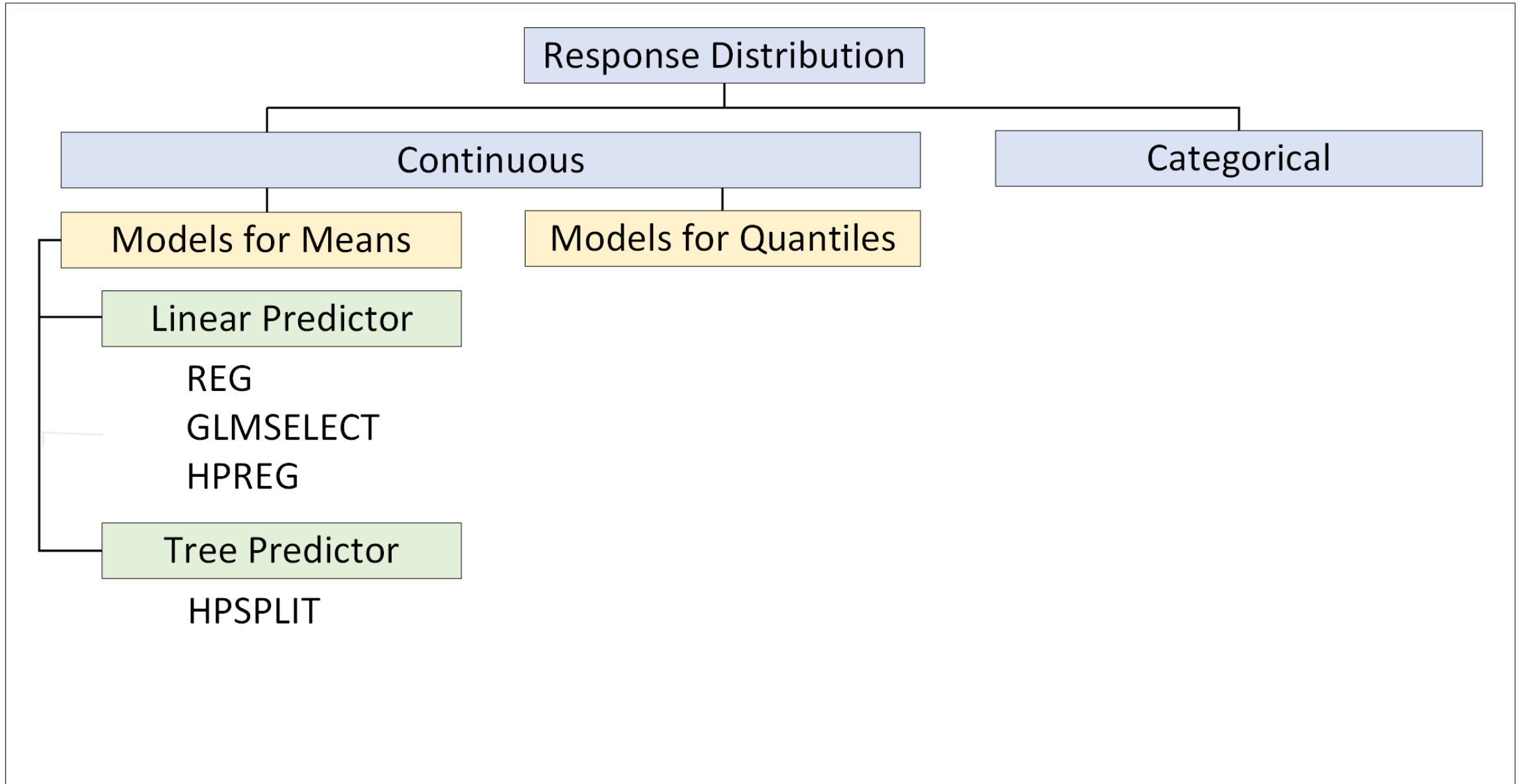
# PROC HPREG is a high-performance regression modeling procedure



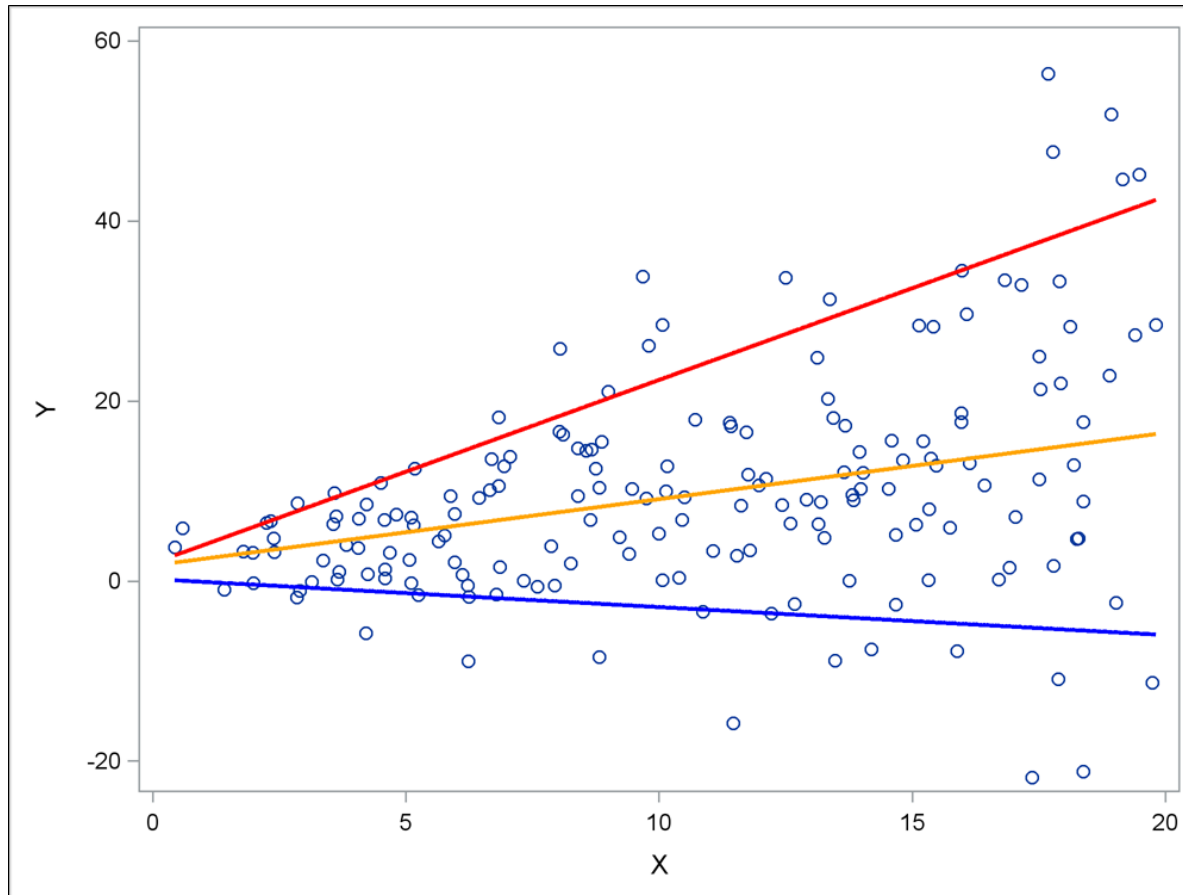
# PROC HPSPPLIT builds classification and regression trees



## Models for means are not always adequate ...



# Regression models for quantiles (percentiles) are useful when the conditional distribution of the response varies with covariates

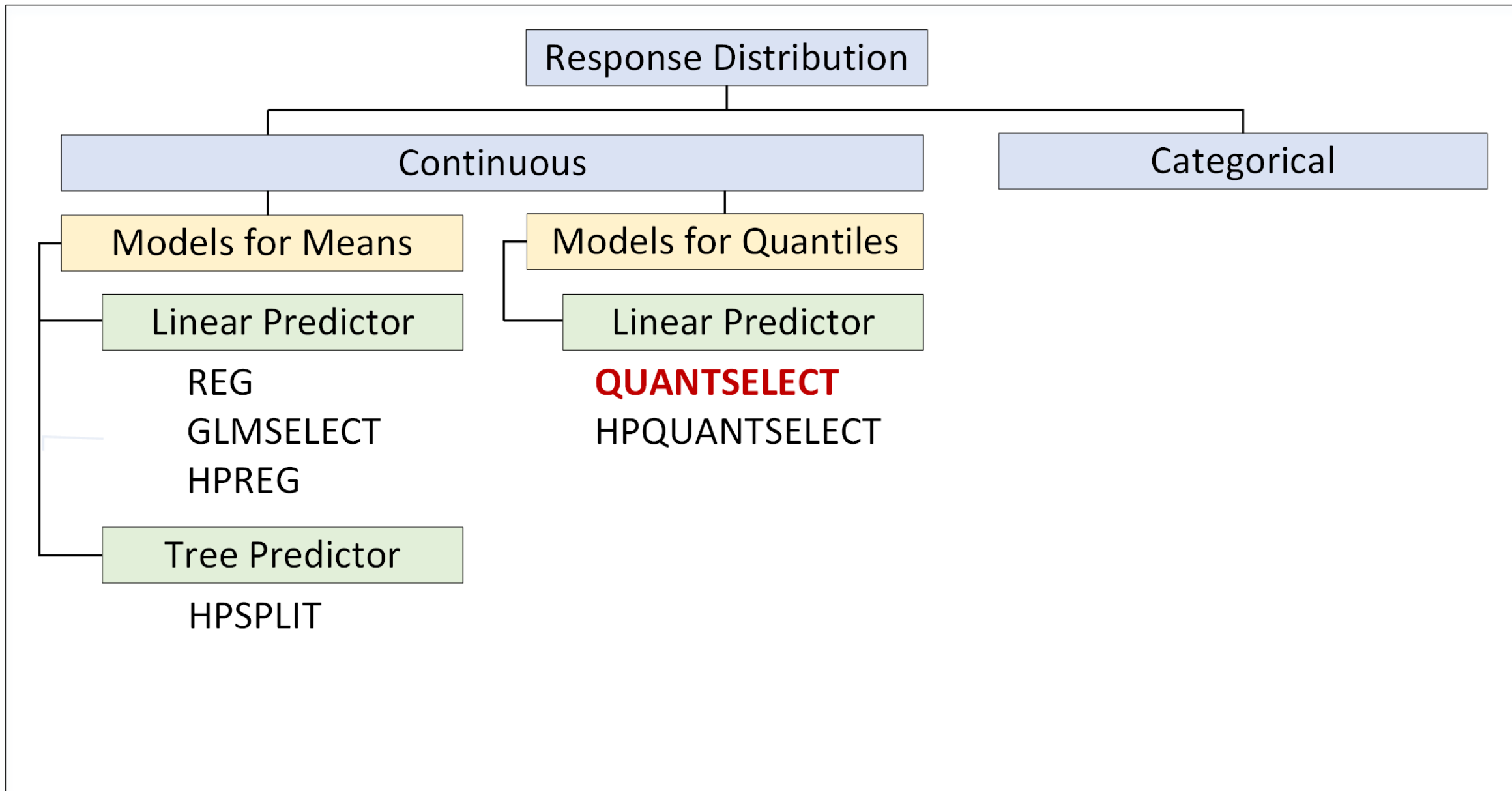


90th percentile

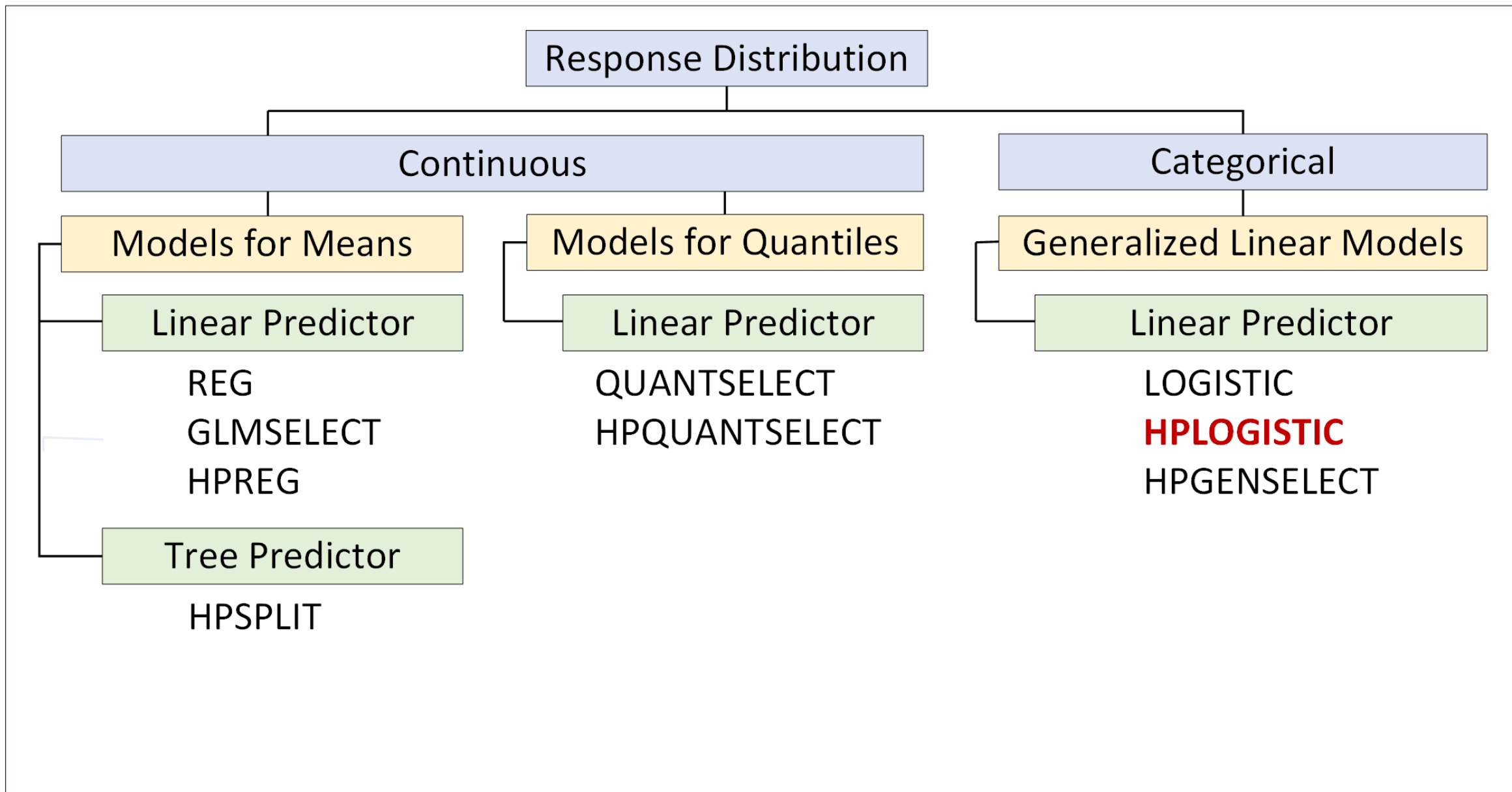
50th percentile

10th percentile

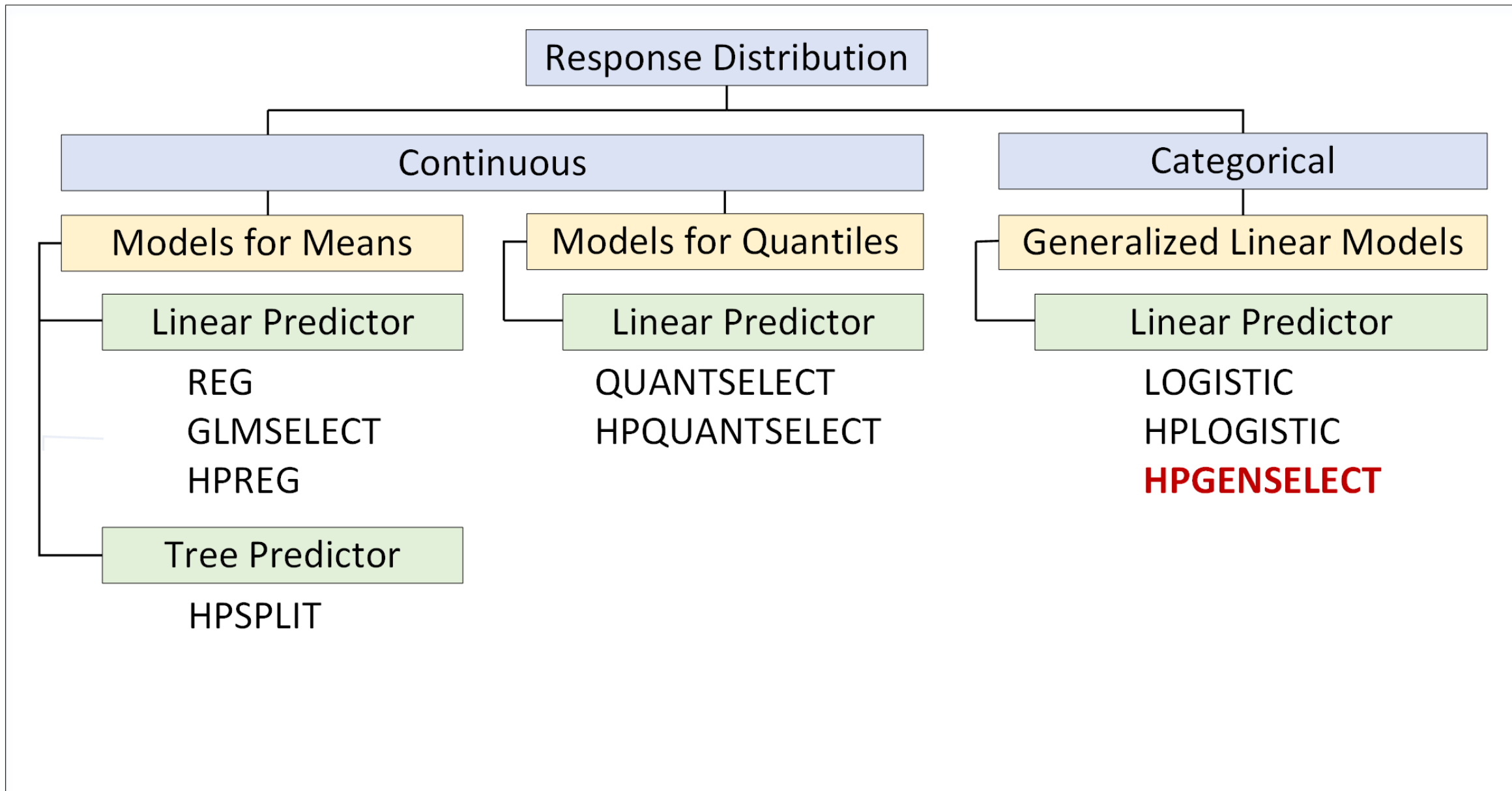
# PROC QUANTSELECT builds quantile regression models



# PROC HPLOGISTIC builds logistic regression models



# PROC HPGENSELECT builds generalized linear models

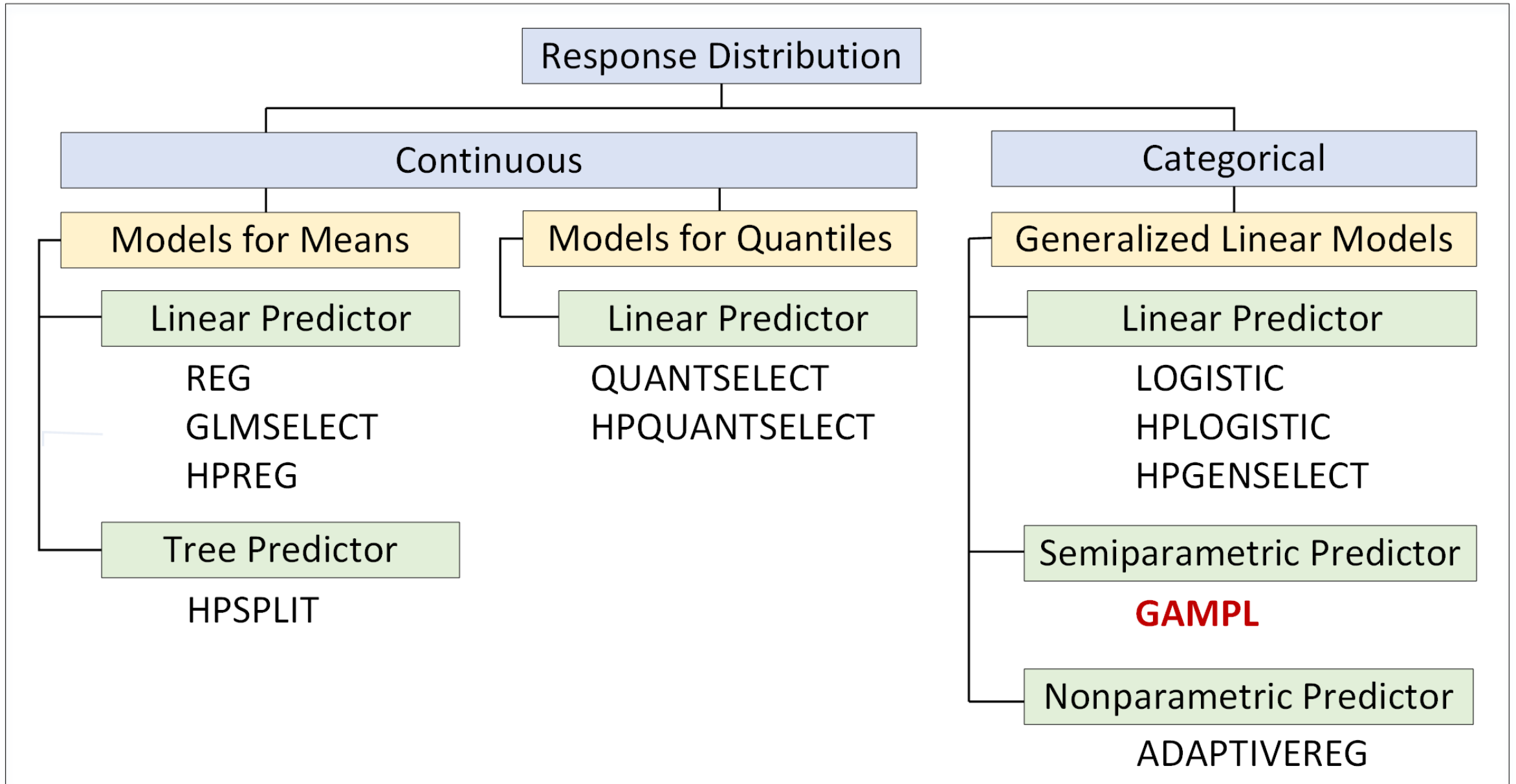




## How does the HPGENSELECT procedure compare with the GENMOD procedure?

<b>PROC HPGENSELECT</b>	<b>PROC GENMOD</b>
Fits and builds models	Fits models
Large to massive data	Moderate to large data
Designed for predictive modeling	Designed for inferential analysis

# The GAMPL procedure fits generalized additive models

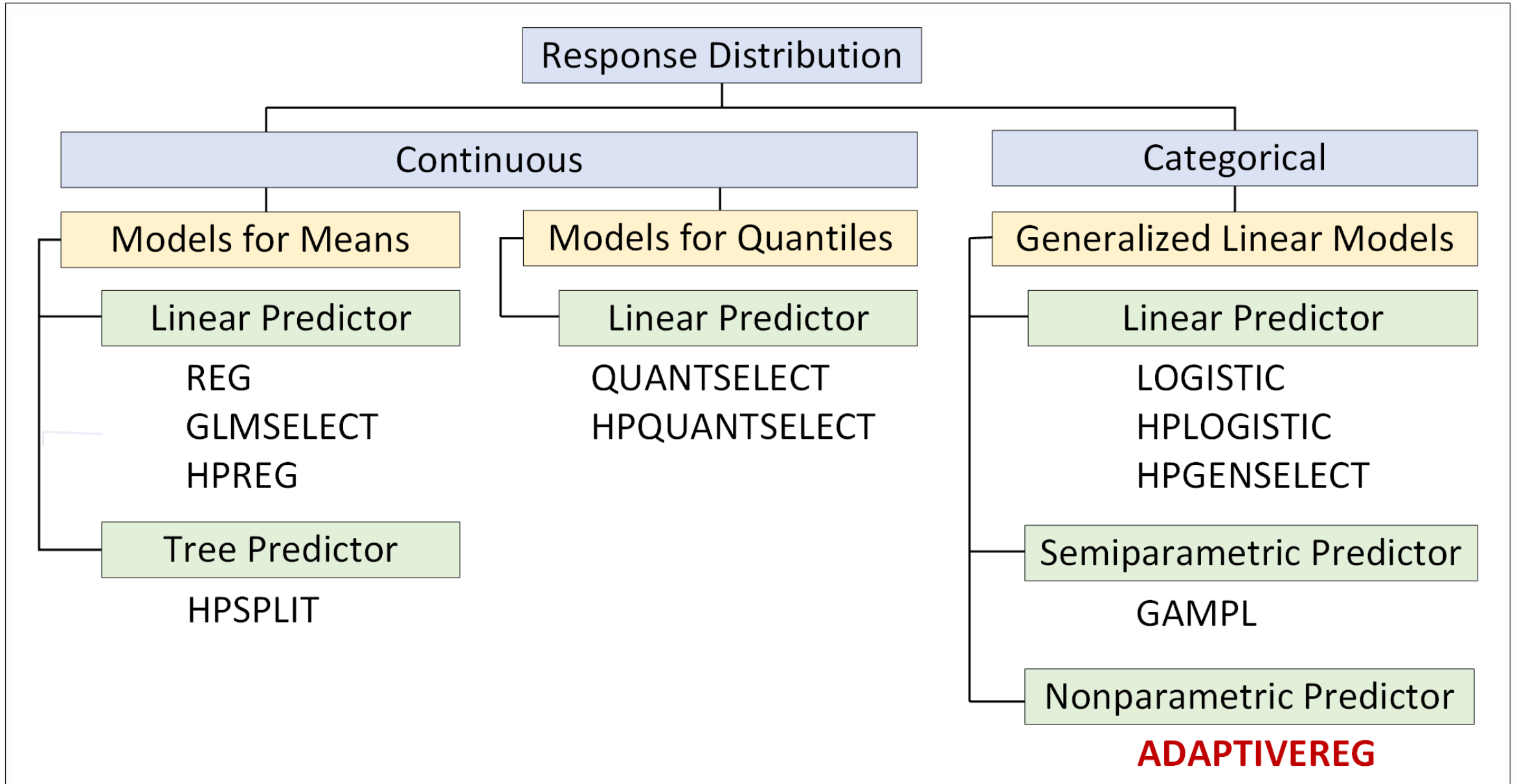


# Generalized additive models provide greater flexibility for describing complex, unknown dependency relationships

## Applications

- Analyzing claim rates for insured mortgages
- Environmental models with spatial effects
- Insurance ratemaking for geographic areas

# The ADAPTIVEREG procedure fits multivariate adaptive regression splines



# Inferential Analysis of Generalized Linear Models



**Tech Support is often asked, “I have longitudinal data with dropouts.  
Can PROC GENMOD do the right GEE analysis?”**

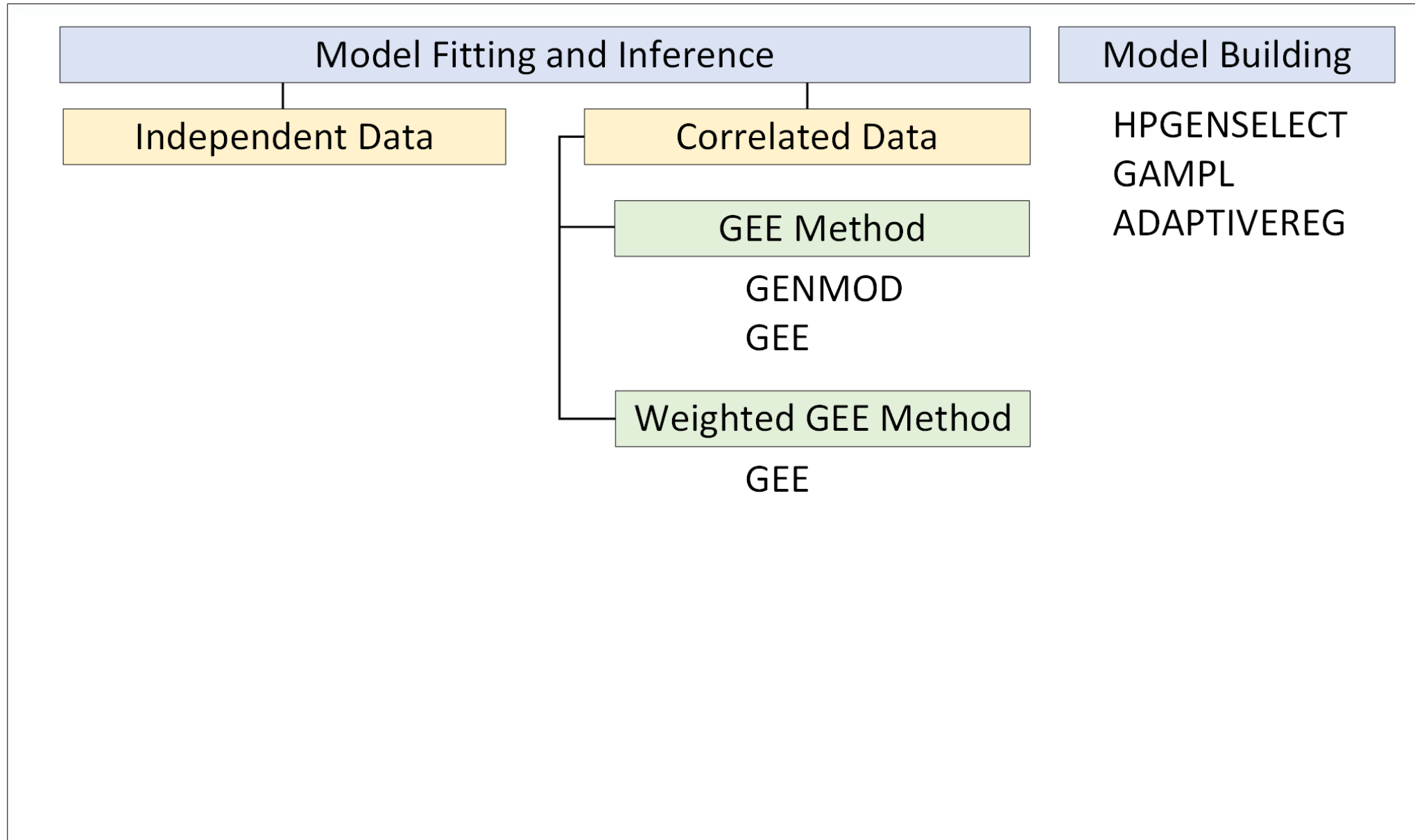


Rob Agnelli and David Schlotzhauer, Analytical Technical Support

## The new GEE procedure implements a weighted GEE method that accounts for dropouts that are missing at random (MAR)

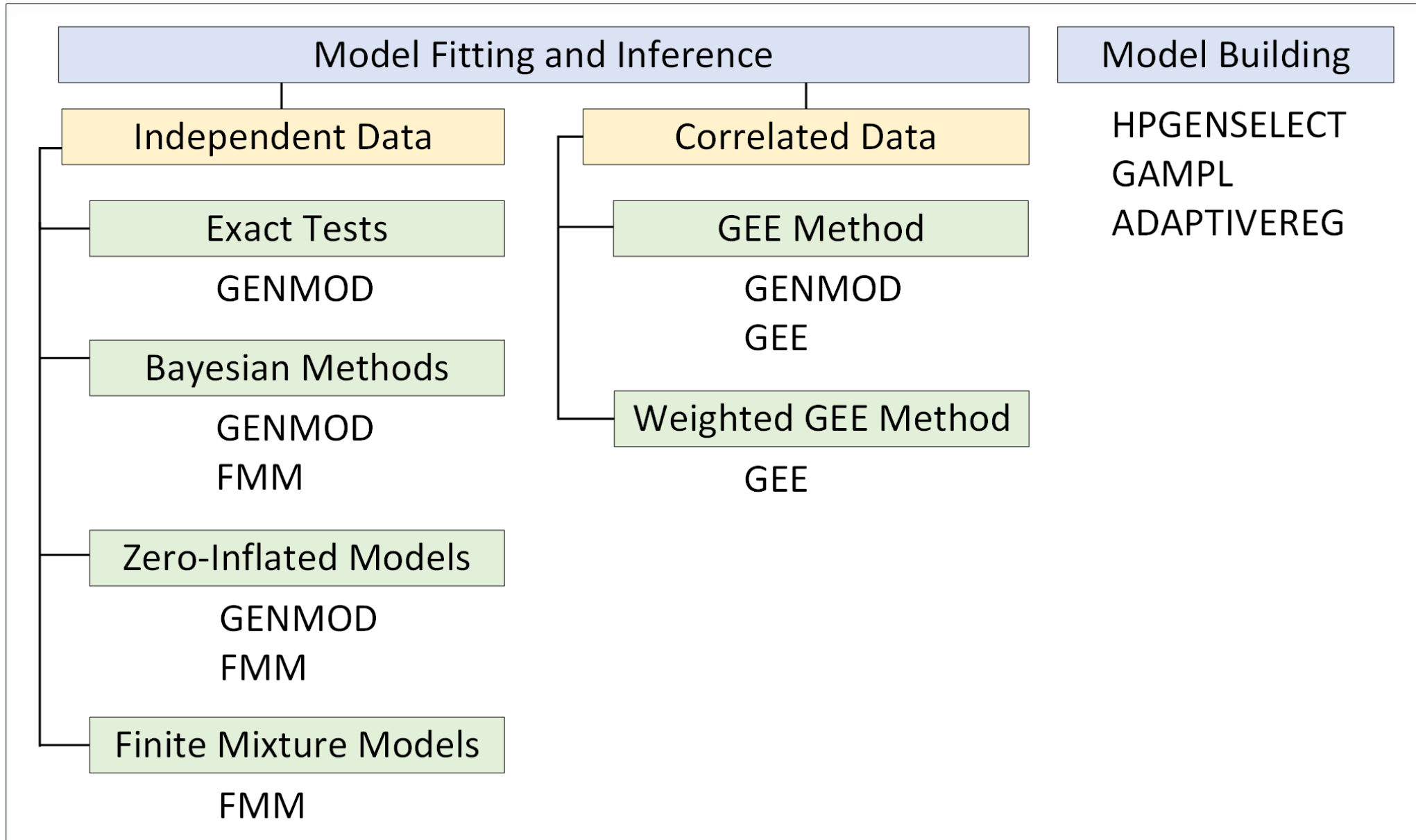
	Standard GEE	Weighted GEE
Procedures	GENMOD and GEE	GEE
Specifications	Response model Correlation	Response model Correlation Missingness model
Inference assuming MCAR	Valid even if correlation is misspecified	Valid even if correlation is misspecified
Inference assuming MAR	Not generally valid	Valid even if correlation is misspecified

# PROC GEE is just one new feature for analysis of generalized linear models





# PROC GENMOD has been enhanced, and PROC FMM has been added



# Survival Analysis



**Tech Support is often asked, “Can I use PROC LIFETEST with time-to-event data that are interval-censored?”**



Paul Savarese  
Analytical Technical Support

## Specialized methods of handling interval-censored data are available in the new ICLIFETEST and ICPHREG procedures

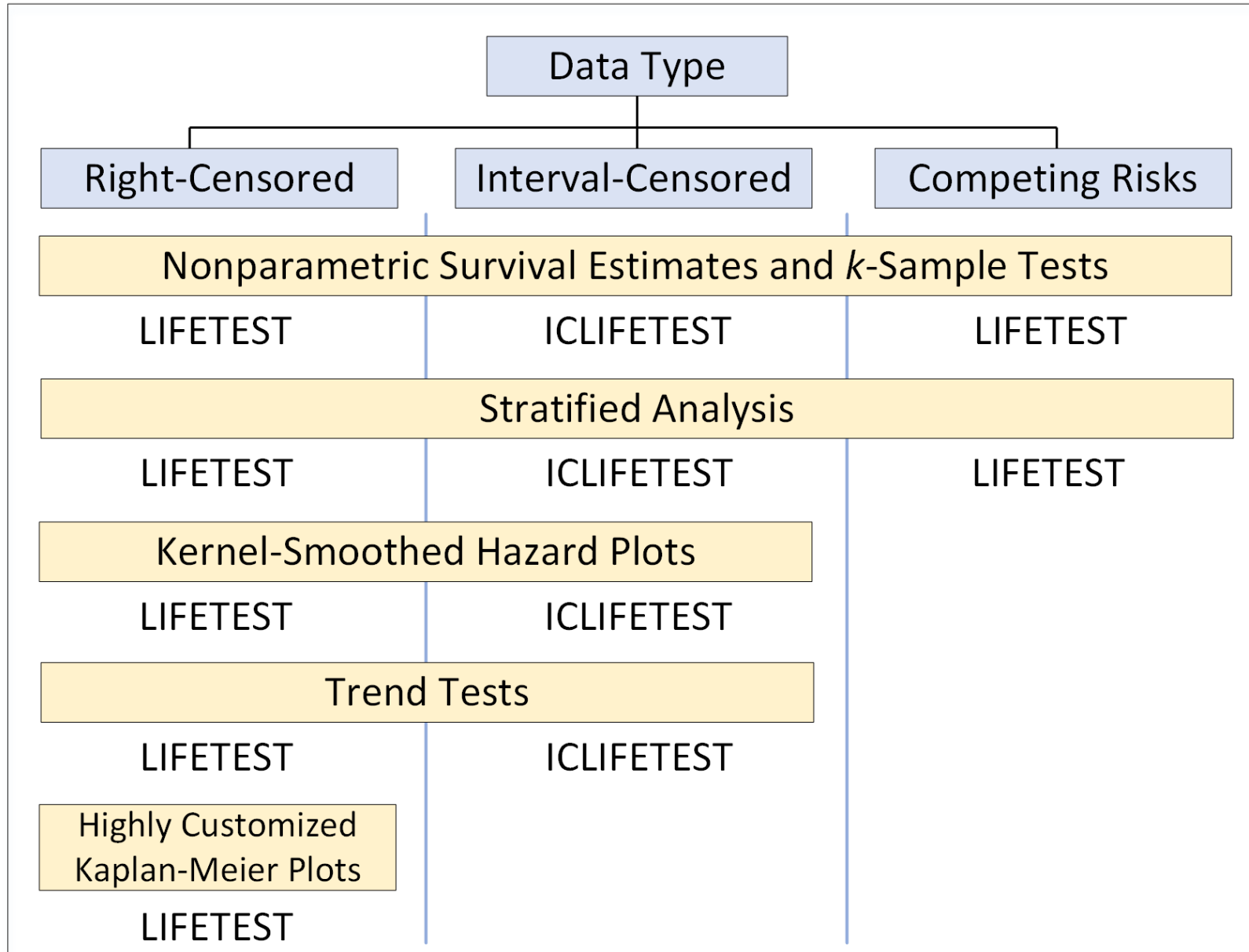
- PROC ICLIFETEST provides nonparametric methods of estimating survival functions and statistical testing
- PROC ICPHREG fits proportional hazards regression models

Imputing midpoints and using the LIFETEST and PHREG procedures is less efficient than applying specialized methods

## There are now six procedures for analyzing time-to-event data, each with a different objective

Procedure	Focus	Approach	Modeling	Censoring
LIFETEST	Survival function	Nonparametric	No	Right
ICLIFETEST	Survival function	Nonparametric	No	Interval
LIFEREG	Lifetime	Parametric	Yes	Right, left, interval
PHREG	Hazard function	Semiparametric	Yes	Right
ICPHREG	Hazard function	Parametric	Yes	Interval
QUANTLIFE	Lifetime	Semiparametric	Yes	Right

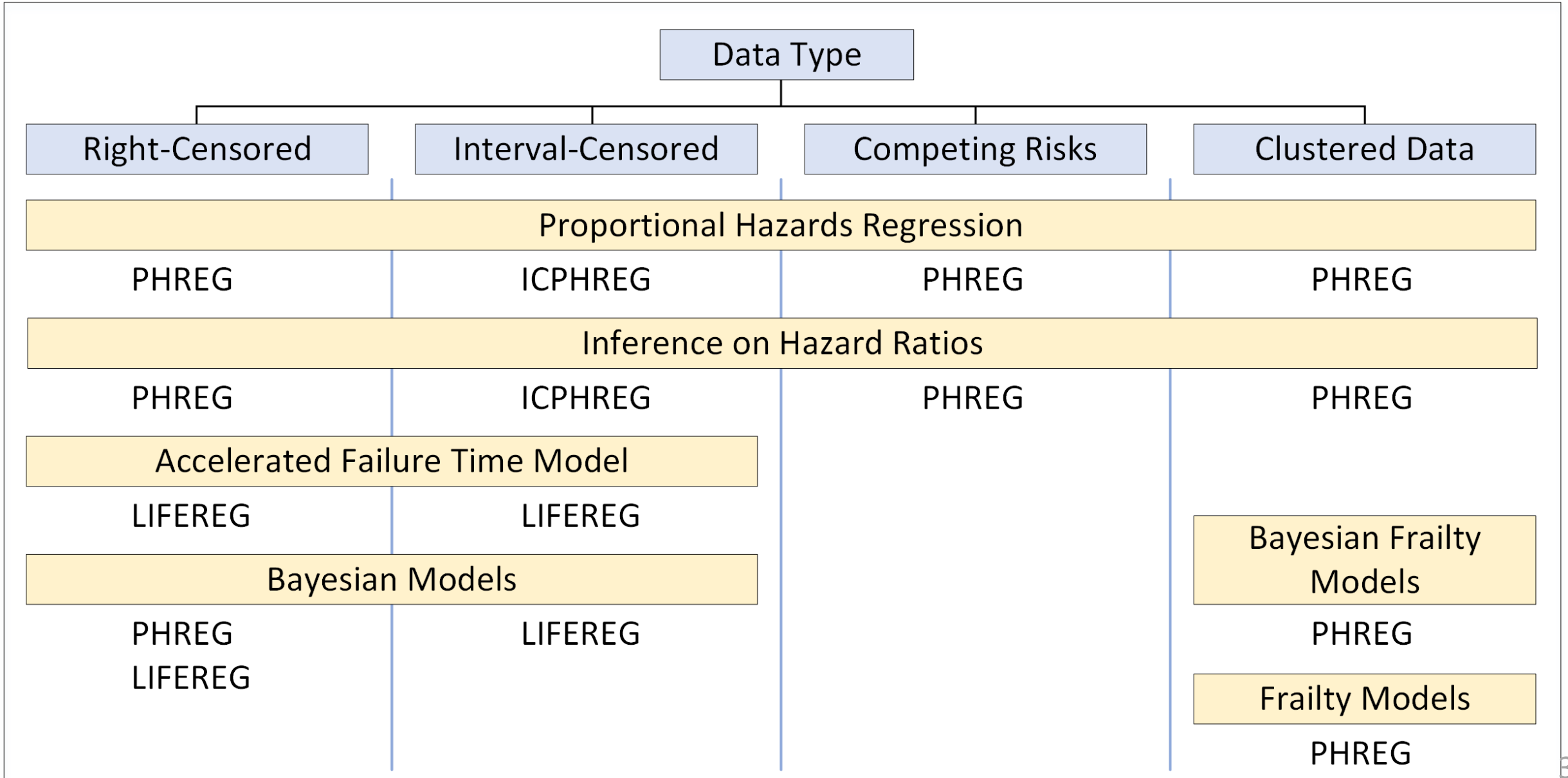
# Survival analysis capability for estimation and testing is growing



## Specialized methods of analyzing competing risks are available in the LIFETEST and PHREG procedures

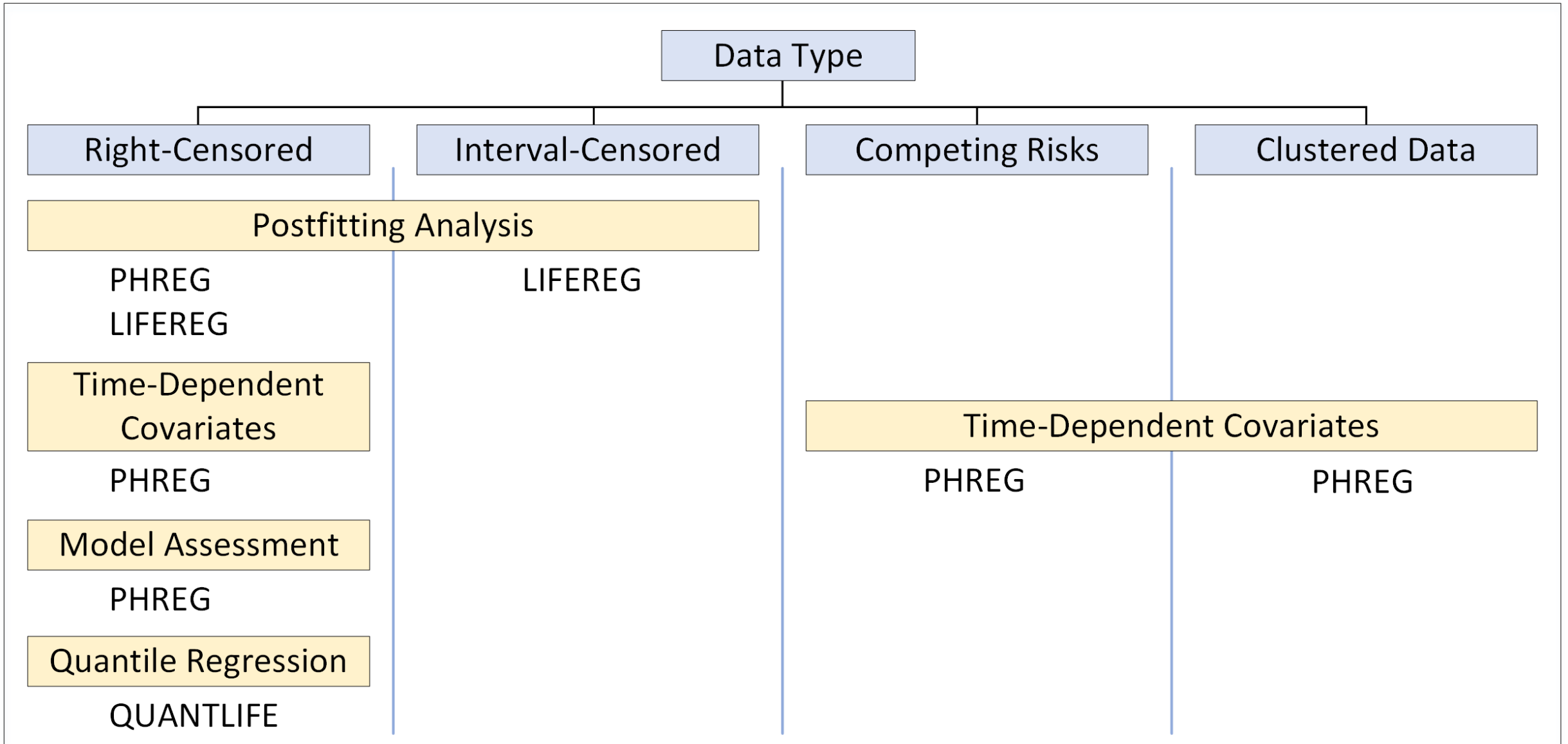
- The cumulative incidence function (CIF) replaces the survival function  
PROC LIFETEST estimates the CIF and provides Gray's test
- The cause-specific hazard function (CSH) replaces the hazard function  
PROC PHREG implements the Fine and Gray model,  
which extends the Cox model to the CSH setting

# Survival analysis capability for modeling is also growing





# Survival analysis capability for modeling is also growing



# Mixed Models

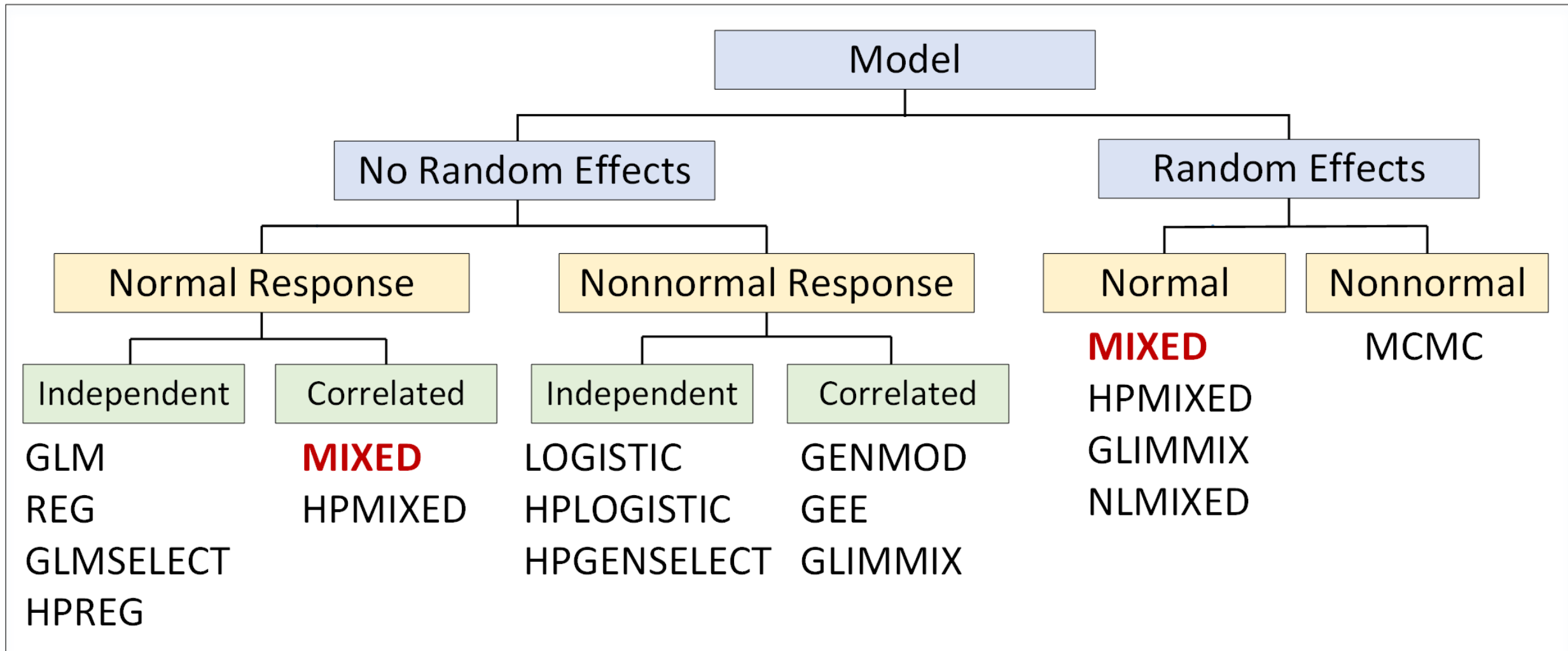


**Tech Support is often asked,  
“How do I decide which mixed model procedure to use?”**

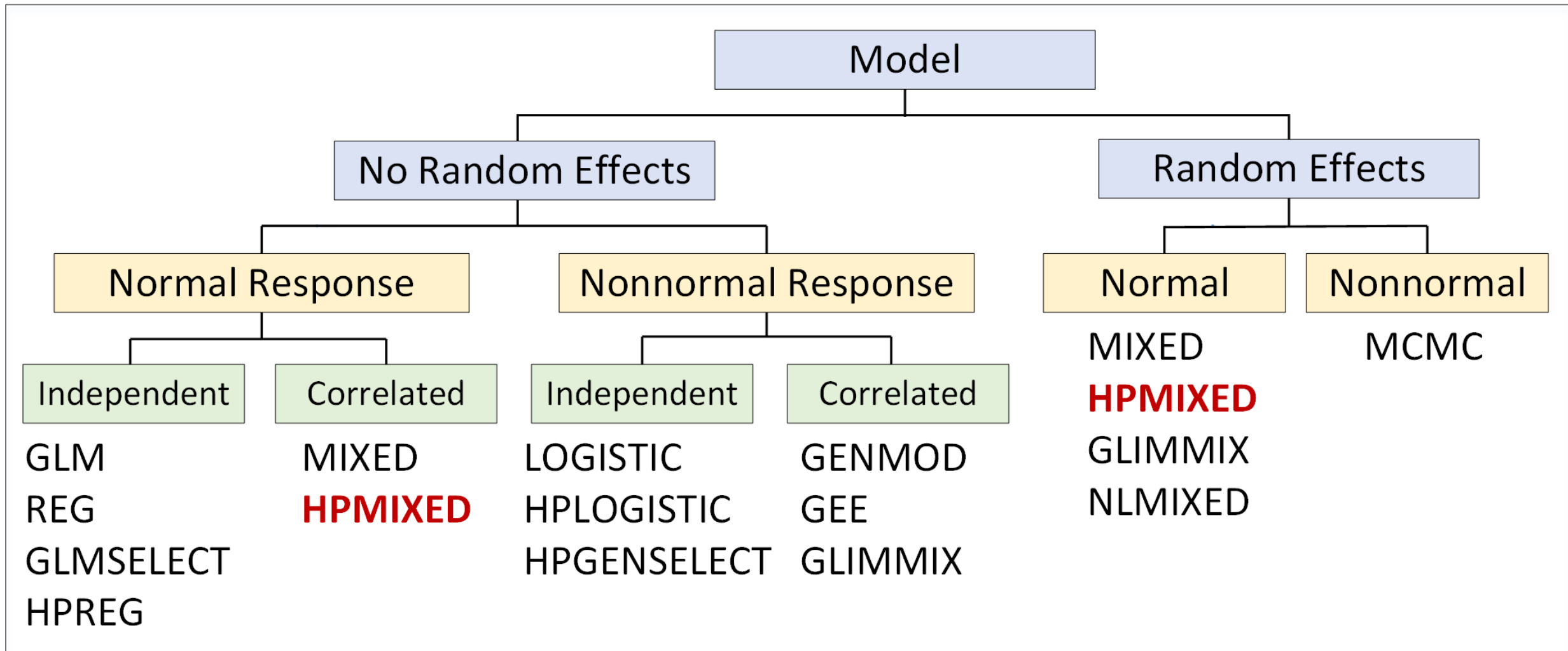


Jill Tao  
Analytical Technical Support

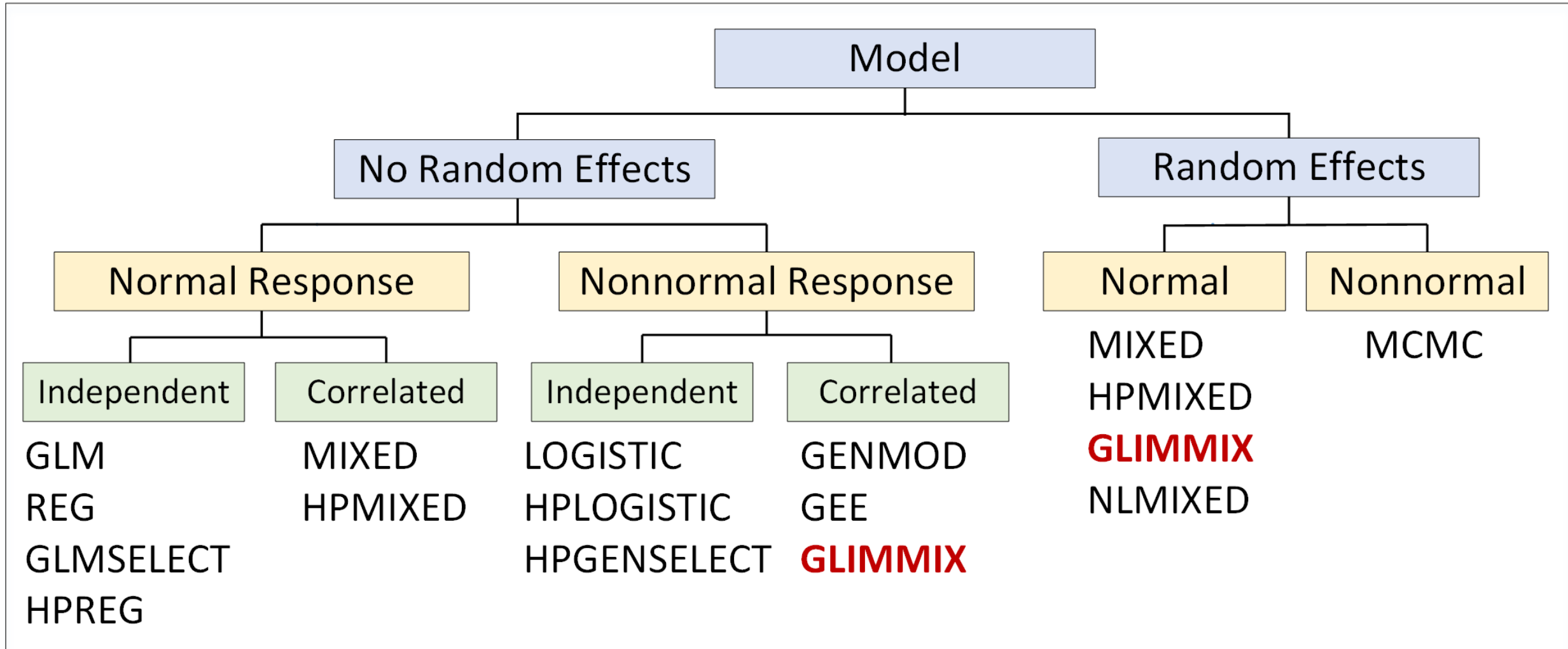
# PROC MIXED is the flagship procedure for linear mixed models, providing generality for model estimation and postfit inference



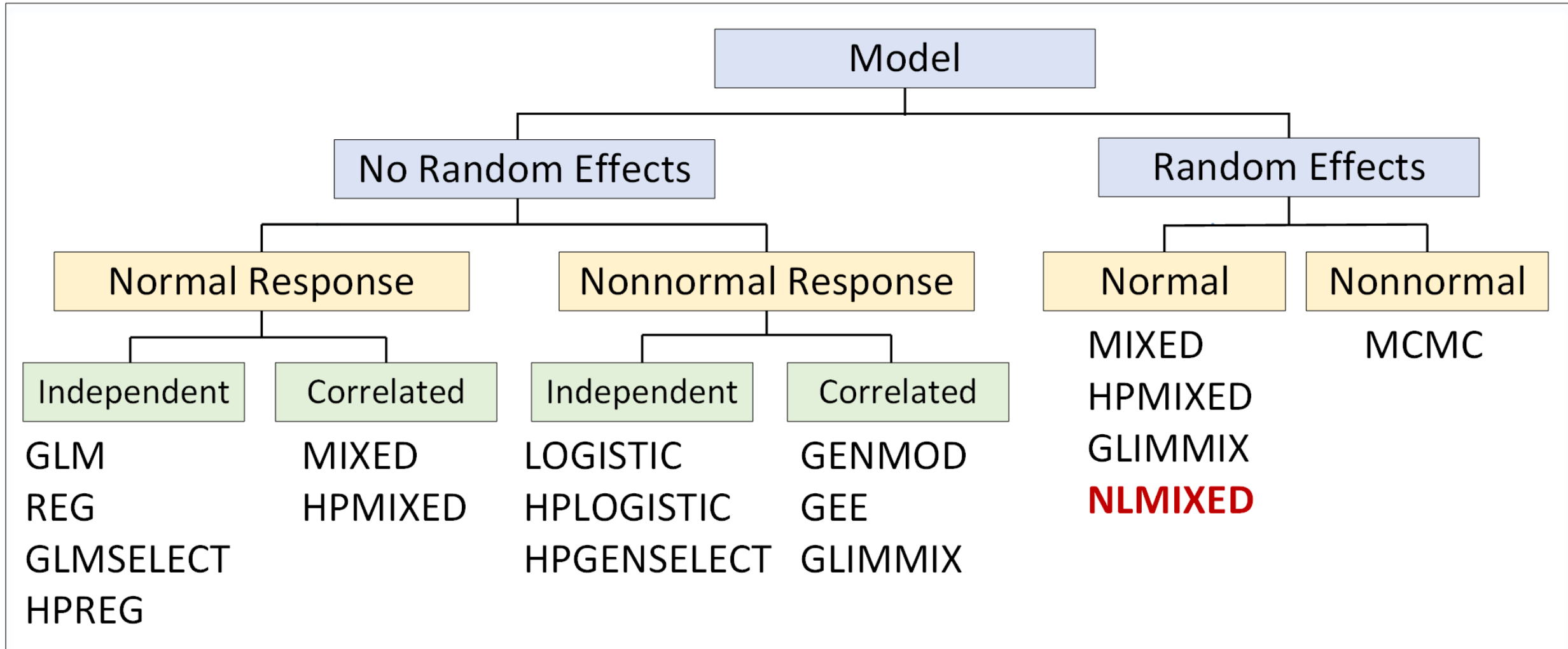
# Use PROC HP MIXED when you need specialized computational methods for large, sparse mixed models



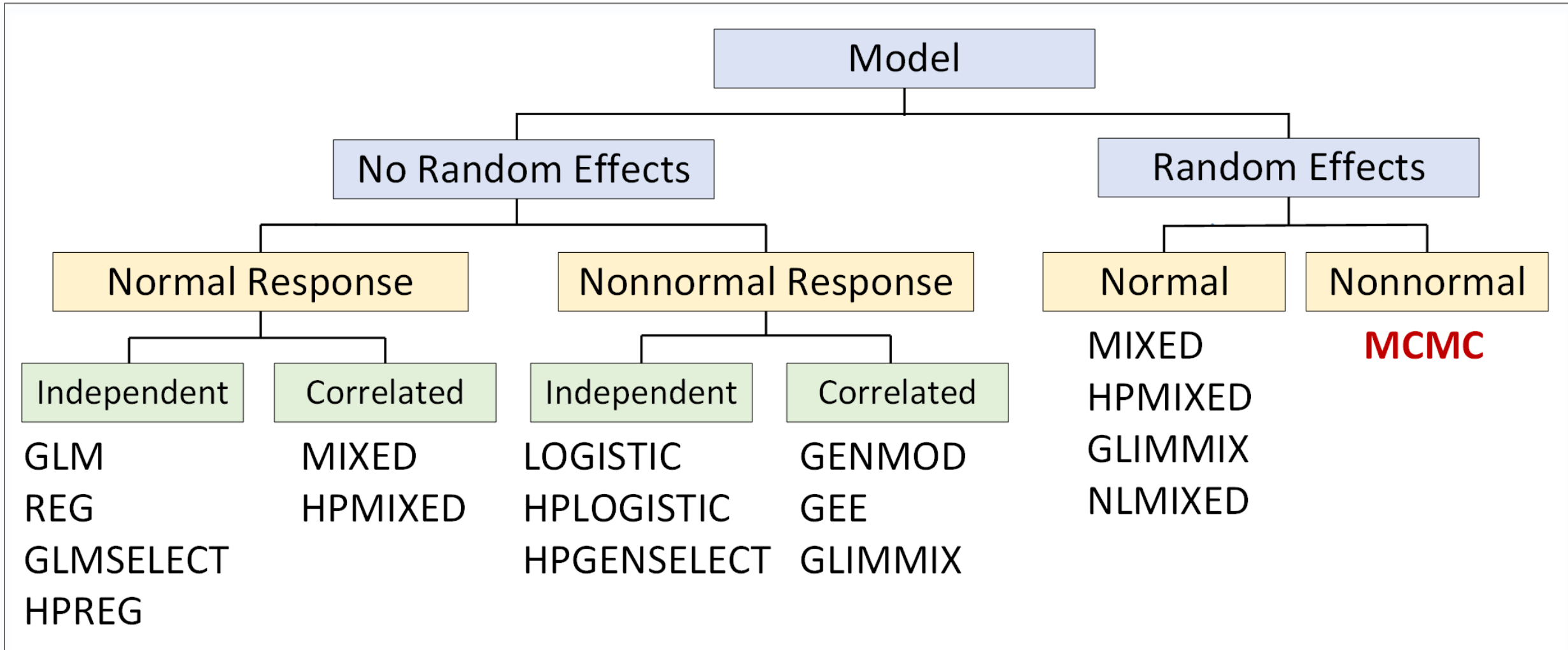
# Use PROC GLIMMIX if your response has a nonnormal distribution that belongs to the exponential family



Use PROC NLMIXED to fit a random coefficients model in which the coefficients enter nonlinearly, or to fit PK/PD models ... the list goes on



# Use PROC MCMC for a wide range of Bayesian models and for models that the other procedures cannot handle





# Summary



**Our flyover has pointed out many new features—  
now, it's time to land and wrap up**



## Newer tools give you greater flexibility for regression modeling ...

Benefit	Method	Procedures
Improved predictive ability and interpretability of regression models	Data partitioning	GLMSELECT, HPREG, HPSPLIT, QUANTSELECT, ADAPTIVEREG, HPLOGISTIC, HPGENSELECT
	Lasso methods and information criteria	GLMSELECT, QUANTSELECT, HPGENSELECT
Regression model building for a variety of response types and for complex dependence structures	Categorical responses	HPLOGISTIC, HPGENSELECT, GAMPL, ADAPTIVEREG
	Quantile regression	QUANTSELECT
	Regression trees	HPSPLIT
	Spline effects	GLMSELECT, GAMPL, ADAPTIVEREG

## ... specialized inference for complex data ...

<b>Benefit</b>	<b>Method</b>	<b>Procedures</b>
Inference for special generalized linear models	Models for overdispersion	GENMOD, FMM
	Exact methods for small samples	GENMOD
	Weighted GEE methods for dropouts in longitudinal studies	GEE
Inference for special types of time-to-event data	Methods for interval-censored data	ICLIFETEST, ICPHREG
	Analysis of competing risks	LIFETEST, PHREG
	Analysis of heterogeneous data	QUANTLIFE

## ... versatile Bayesian methods, and high-performance computing

Benefit	Method	Procedures
Advantages of Bayesian methods, including model versatility and highly interpretable results	Generalized linear models Survival analysis models Finite mixture models Mixed models General Bayesian models	GENMOD LIFEREG, PHREG, MCMC FMM MCMC MCMC
High-performance computing for large data	Regression model building  Generalized additive models Regression trees Large, sparse mixed models	HPREG, HPLOGISTIC, HPQUANTSELECT, HPGENSELECT, HPSPLIT  GAMPL HPSPLIT HPMIXED

Learn more at <http://support.sas.com/statistics>

## Welcome to Statistics and Operations Research



SAS has long developed software for data analysis, econometrics, operations research, and quality improvement. The purpose of these pages is to provide our users with technical information about using this software, including details about software capabilities, examples, papers, e-newsletter, and communities.

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**SAS/ETS** software offers a broad array of time series, forecasting, and econometric techniques that enable modeling, forecasting, and simulation of business processes for improved strategic and tactical planning.

**SAS/ETS 14.2** introduces the new SASENOAA and SASERAIN interface engines as well as the new SPATIALREG procedure along with new features for the HPCDM, HPSEVERITY, SEVERITY, QLIM, SSM, TIMESERIES, and VARMAX procedures and the SASEFAME, SASEFRED, SASEQUAN, and SASEXFSD interface engines.

Read about [What's New in SAS/ETS 14.2](#).

### HIGHLIGHTS

- ◆ Latest e-Newsletter
- ◆ 14.2 Highlights and Information
- ◆ SAS Analytical Handouts
- ◆ SAS Macros for Experimental Design and Choice Modeling
- ◆ ODS Statistical Graphics

### VIDEOS

- ◆ Computing an Optimal Blackjack Strategy with SAS/OR **New**
- ◆ SAS Simulation Studio: Power Up by Calling SAS Programs **New**
- ◆ What's New in Econometric Modeling in SAS/ETS 14.1
- ◆ Spatial Dependence, Nonlinear Panel Models, and More New Features in SAS/ETS 14.1
- ◆ Exploring Econometric Tasks in SAS Studio
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- ◆ See all videos

### PAPERS

- ◆ SAS/STAT 14.1: Methods for Massive, Missing, or Multifaceted Data
- ◆ Practical Applications of SAS Simulation Studio

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