## Package 'expertsury'

February 20, 2025

Title Incorporate Expert Opinion with Parametric Survival Models

Version 1.4.0

Date 2025-02-17

**Description** Enables users to incorporate expert opinion with parametric survival analysis using a Bayesian or frequentist approach. Expert Opinion can be provided on the survival probabilities at certain time-point(s) or for the difference in mean survival between two treatment arms. Please reference it's use as Cooney, P., White, A. (2023) <doi:10.1177/0272989X221150212>.

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**Encoding** UTF-8

LazyData true

LazyDataCompression xz

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**Depends** R (>= 3.5.0), survival

Imports abind, assertthat, dplyr, generics, ggplot2, magrittr (>= 2.0), Matrix, numDeriv, purrr, Rcpp (>= 0.12.0), Rdpack, rlang, rms, rstan (>= 2.26.0), rstantools (>= 2.2.0), rstpm2, scales, SHELF, statmod, stats, stringr, tibble, tidyr, tidyselect, utils, broom, sn, muhaz, mytnorm, quadprog,

**LinkingTo** BH (>= 1.66.0), Rcpp (>= 0.12.0), RcppArmadillo, RcppEigen (>= 0.3.3.3.0), RcppParallel (>= 5.0.1), rstan (>= 2.26.0), splines2, StanHeaders (>= 2.26.0)

SystemRequirements GNU make

**Suggests** rmarkdown, bookdown, knitr, rjags, R2jags, loo, xlsx, shiny, shinyWidgets, shinycssloaders, shinyjs, shinyMatrix, shinybusy, ggpubr, splines2, survminer, colorspace, testthat, covr, eha

VignetteBuilder knitr

RdMacros Rdpack

Config/testthat/edition 3

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## **NeedsCompilation** yes

**Author** Philip Cooney [aut, cre] (<a href="https://orcid.org/0000-0001-9649-0195">https://orcid.org/0000-0001-9649-0195</a>), Arthur White [ths] (<a href="https://orcid.org/0000-0002-7268-5163">https://orcid.org/0000-0002-7268-5163</a>)

Maintainer Philip Cooney <phcooney@tcd.ie>

**Repository** CRAN

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## Description

Contains functions to include expert opinion with the parametric models commonly used in health economic modelling. Theoretical details are described elsewhere (Cooney and White 2023). Borrows many functions from the survHE package (Baio 2020) and flexsurv package (Jackson 2016).

#### **Details**

Package: expertsurv
Type: Package
Version: 1.4.0
Date: 2023-09-22

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LazyLoad: yes

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Integrate expert opinions on survival and mean differences in survival with common parametric survival models using either a Bayesian or frequentist framework.

#### Author(s)

Philip Cooney Package Creator, Maintainer Arthur White Thesis Supervisor

#### References

P Cooney (2023). expertsurv: Incorporating expert opinion into parametric survival models.

Baio G (2020). "survHE: Survival Analysis for Health Economic Evaluation and Cost-Effectiveness Modeling." *Journal of Statistical Software*, **95**(14), 1–47. doi:10.18637/jss.v095.i14. Cooney P, White A (2023). "Direct Incorporation of Expert Opinion into Parametric Survival Models to Inform Survival Extrapolation." *Medical Decision Making*, **1**(1), 0272989X221150212. doi:10.1177/0272989X221150212, PMID: 36647200, https://doi.org/10.1177/0272989X221150212, https://doi.org/10.1177/0272989X221150212. Jackson C (2016). "flexsurv: A Platform for Parametric Survival Modeling in R." *Journal of Statistical Software*, **70**(8), 1–33. doi:10.18637/jss.v070.i08.

```
#Define expert opinion
require("dplyr")
param_expert_example1 <- list()</pre>
#1 timepoint and 2 experts with equal weight,
#first a normal distribution, second a non-standard t-distribution with
#3 degrees of freedom
param_expert_example1[[1]] <- data.frame(dist = c("norm","t"),</pre>
                                wi = c(0.5, 0.5), # Ensure Weights sum to 1
                                param1 = c(0.1, 0.12),
                                param2 = c(0.05, 0.05),
                                 param3 = c(NA,3)
timepoint_expert <- 14
data2 <- data %>% rename(status = censored) %>% mutate(time2 = ifelse(time > 10, 10, time),
                  status2 = ifelse(time> 10, 0, status))
example1 <- fit.models.expert(formula=Surv(time2,status2)~1,data=data2,</pre>
                               distr=c("wph", "gomp"),
                               method="mle",
                               pool_type = "log pool",
                               opinion_type = "survival",
                               times_expert = timepoint_expert,
                               param_expert = param_expert_example1)
```

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```
#Visualize the goodness of fit
model.fit.plot(example1, type = "aic")
#Visualize the survival curve
plot(example1, add.km = TRUE, t = 0:30)
```

bc

Breast cancer survival data

## **Description**

Survival times of 686 patients with primary node positive breast cancer. See **flexsurv** for details.

#### Usage

bc

#### **Format**

An object of class data. frame with 686 rows and 4 columns.

bos

Bronchiolitis obliterans syndrome after lung transplants

## **Description**

See flexsury for details.

#### **Format**

A data frame containing a sequence of observed or censored transitions to the next stage of severity or death. It is grouped by patient and includes histories of 204 patients. All patients start in state 1 (no BOS) at six months after transplant, and may subsequently develop BOS or die.

#### **Source**

Papworth Hospital, U.K.

#### References

Heng. D. et al. (1998). Bronchiolitis Obliterans Syndrome: Incidence, Natural History, Prognosis, and Risk Factors. Journal of Heart and Lung Transplantation 17(12)1255–1263.

compiled\_models\_saved Object with Compiled Stan Code

#### **Description**

Pre-compiled stan models that can be generated by the compile\_stan function. These compiled stan models can be supplied to the fit.models.expert function with the argument compile\_mods. This greatly facilitates the estimation of the parametric survival models run by stan.

#### **Source**

Generated from compile\_stan

compile\_stan

Compile Specified Stan Models for Bayesian Survival Analysis

## **Description**

The compile\_stan function pre-compiles specified Stan models used in the expertsurv package for Bayesian survival analysis. By compiling the models ahead of time, you can significantly reduce computation time during model fitting, as the models won't need to be compiled each time they're used.

#### Usage

```
compile_stan(dist_stan = c("exp", "wei", "wph", "rps", "llo", "lno"))
```

#### **Arguments**

dist\_stan

A character vector specifying the distributions to compile. Options include:

"exp" Exponential distribution

"wei" Weibull distribution

"wph" Weibull Proportional Hazards

"rps" Restricted Piecewise Survival

"110" Log-Logistic distribution

"lno" Log-Normal distribution

Defaults to c("exp", "wei", "wph", "rps", "llo", "lno").

#### **Details**

Pre-compiling Stan models is recommended when working with Bayesian methods in survival analysis, as it avoids the overhead of compiling models during each function call. This is particularly beneficial when running multiple models or iterations.

The function internally calls rstan::stan\_model() for each specified distribution, compiling the Stan code associated with that model.

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#### Value

A named list of compiled Stan models corresponding to the specified distributions.

#### See Also

```
compile stan
```

#### **Examples**

```
library(dplyr)
# Prepare the data
# Assume 'data' is your dataset containing 'time' and 'censored' variables
data2 <- data %>%
  rename(status = censored) %>%
  mutate(
   time2 = ifelse(time > 10, 10, time),
    status2 = ifelse(time > 10, 0, status)
# Pre-compile Stan models (ideally after installing the package)
# This step can be time-consuming but only needs to be done once per session
compiled_models_saved <- compile_stan()</pre>
# Fit the survival models using Bayesian methods
example1 <- fit.models.expert(</pre>
  formula = Surv(time2, status2) ~ 1,
  data = data2,
  distr = c("wei", "gom"), # Weibull and Gompertz distributions
  method = "bayes"
  compile_mods = compiled_models_saved)
# Examine the results
summary(example1)
plot(example1)
```

cred\_int

Credible interval for pooled distribution

## Description

Returns the interval based on defined quantiles. The approach used only provides an approximate (although quite accurate) integral.

## Usage

```
cred_int(plt_obj, val = "linear pool", interval = c(0.025, 0.975))
```

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## Arguments

plt\_obj A plot object from plot\_expert\_opinion.

val The name of the opinion for which the interval will be generated.

interval A vector of the upper and lower probabilities. Default is the standard 95% interval

#### Value

Credible interval based on the pooled distribution

#### **Examples**

data

A fictional survival trial taken directly from survHE.

## Description

A dataset containing fictional data from a trial, where the main outcome is in terms of time-to-event and censoring indicator and with additional covariates.

## Usage

data

#### **Format**

An object of class data. frame with 367 rows and 8 columns.

## References

Baio G (2020). "survHE: Survival Analysis for Health Economic Evaluation and Cost-Effectiveness Modeling." *Journal of Statistical Software*, **95**(14), 1–47. doi:10.18637/jss.v095.i14.

8 elicit\_surv

elicit\_surv

Elicit survival judgements interactively and estimate survival models

#### **Description**

Opens up a web browser (using the shiny package), from which you can specify judgements and fit distributions for multiple timepoints and experts. Plots of the fitted density functions are provided overlayed on the survival data (where appropriate).

## Usage

```
elicit_surv(compile_mods = NULL)
```

## **Arguments**

compile\_mods

list of compiled stan models generated by compile\_stan. Supplying the compiled stan models will greatly speed up the computation of the Bayesian analysis (otherwise each time a stan model is run it will be compiled (and not reused between runs)).

#### **Details**

Once the elicitation is complete the analysis can be run. Click "Download R objects" to download the expertsurv object generated from the analysis. Click "Download report" to generate a report including plots and parameter values for the parametric survival models. For detailed instructions use browseVignettes("expertsurv")

## Value

If "Download R objects" selected an expert surv object containing the results of the elicitation and analysis. The object includes:

- model: The fitted survival models.
- parameters: The estimated parameters for each model.

If "Download report" selected either .html, .pdf or .docx document is downloaded with:

- plot: Plots of the fitted survival overlayed on the Kaplan Meier data and plot of expert opinion as probability distributions.
- summary: A summary report of the analysis including goodness of fit and parameter values.

## Author(s)

Philip Cooney phcooney@tcd.ie

```
if (interactive()) {
elicit_surv()
}
```

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fit.models.expert

Fit Parametric Survival Models Incorporating Expert Opinion

#### **Description**

The fit.models.expert function extends the capabilities of the survHE package by allowing users to fit parametric survival models that incorporate expert opinion. Expert opinions can be on survival probabilities at specific time points or on expected differences in survival between groups. This function is particularly useful when empirical data is scarce or incomplete, and expert knowledge can help inform the analysis.

## Usage

```
fit.models.expert(
  formula = NULL,
  data,
  distr = NULL,
  method = "bayes",
  opinion_type = "survival",
  param_expert = NULL,
  ...
)
```

## **Arguments**

formula

An object of class formula specifying the survival model to be fitted, as per fit.models in the **survHE** package. The left-hand side must be a Surv object, and the right-hand side specifies the covariates.

data

A data frame containing the variables specified in the formula, as per fit.models.

distr

A character vector specifying the distribution(s) to be used for the survival model(s), as per fit.models. Options include, but are not limited to:

- "exp": Exponential distribution
- "wei": Weibull distribution
- "gom": Gompertz distribution
- "gengamma": Generalized Gamma distribution
- "genf": Generalized F distribution (not available for method = "bayes")
- "rps": Royston-Parmar spline model (not available with opinion\_type = "mean")

Note: The Generalized F model is not available when method = "bayes", and the Royston-Parmar model is not available with expert opinion on the mean survival.

method

The estimation method to be used. Options are:

- "mle": Maximum Likelihood Estimation
- "bayes": Bayesian estimation using either Stan or JAGS

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Note: The "inla" method is not included. For Bayesian analysis, specify method = "bayes" (do not use "hmc" as in **survHE**).

opinion\_type

A character string specifying the type of expert opinion provided:

- "survival": Expert opinion on the survival function at specific time points
- Other values (e.g., "mean"): Expert opinion on differences in expected survival (area under the survival curve)

param\_expert

A list where each element corresponds to a time point (if applicable) and contains a data frame of expert opinions. Each data frame should have the following columns, with each row representing an expert:

- dist Name of the distribution assigned to each expert's opinion. Options include "norm", "t", "lnorm", "gamma", "beta".
- wi Weight of the expert's opinion. Weights must sum to 1 across all experts for each time point.
- param1 First parameter of the specified distribution (e.g., mean for normal distribution). Parameters follow the conventions of the **SHELF** package.
- param2 Second parameter of the specified distribution (e.g., standard deviation for normal distribution).
- param3 Third parameter of the distribution, if applicable (e.g., degrees of freedom for the t-distribution); otherwise, set to NA.

Other arguments required depending on the analysis. Important ones include:

- id\_St Required if the model includes covariates (e.g., treatments) and expert opinion on survival probabilities. Specifies the row number in the data frame representing the covariate pattern for which the expert opinion is provided.
- id\_trt Required if including expert opinion about differences in expected survival. Specifies the row number representing the treatment group.
- id\_comp Required if including expert opinion about differences in expected survival. Specifies the row number representing the comparator group.
- times\_expert A numeric vector of time points at which expert opinion on survival probabilities is provided.
- compile\_mods For Bayesian analysis, a list of pre-compiled Stan models can be supplied to speed up computation. Pre-compiling models is recommended and can be done using compile\_stan.

#### **Details**

This function enables the integration of expert opinion into parametric survival models. Expert opinion can be particularly valuable when data is limited or censored, as it allows for informed estimates of survival functions or differences between treatment groups.

The function supports both Maximum Likelihood Estimation (MLE) and Bayesian methods. For Bayesian estimation, models are fitted using Stan or JAGS, depending on the distribution. Precompiling Stan models using compile\_stan is highly recommended to reduce computation time.

#### Value

An object of class expertsurv containing the fitted models, parameter estimates, and other relevant information. This object can be used with plotting and summary functions for further analysis.

. . .

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```
## Not run:
library(dplyr)
# Example 1: Incorporating Expert Opinion on Survival Probabilities Using MLE
# Define expert opinion as a normal distribution centered at 0.1 with sd 0.05
param_expert_example1 <- list()</pre>
param_expert_example1[[1]] <- data.frame(</pre>
  dist = "norm",
  wi = 1, # Ensure weights sum to 1 across experts
  param1 = 0.1,
  param2 = 0.05,
  param3 = NA
)
# Time point at which expert opinion is provided
timepoint_expert <- 14 # For example, 14 months</pre>
# Prepare the data
# Assume 'data' is your dataset containing 'time' and 'censored' variables
data2 <- data %>%
  rename(status = censored) %>%
 mutate(
   time2 = ifelse(time > 10, 10, time),
   status2 = ifelse(time > 10, 0, status)
  )
# Fit the survival models using MLE, incorporating expert opinion
example1 <- fit.models.expert(</pre>
  formula = Surv(time2, status2) ~ 1,
  data = data2,
  distr = c("wei", "gom"), # Weibull and Gompertz distributions
  method = "mle",
  opinion_type = "survival",
  times_expert = timepoint_expert,
  param_expert = param_expert_example1
)
# Plot the fitted survival curves along with the Kaplan-Meier estimate
plot(example1, add.km = TRUE, t = 0:20)
# Compare models using Akaike Information Criterion (AIC)
model.fit.plot(example1, type = "aic")
# Example 2: Incorporating Expert Opinion Using Bayesian Estimation
# Pre-compile Stan models (ideally after installing the package)
# This step can be time-consuming but only needs to be done once per session
compiled_models_saved <- compile_stan()</pre>
# Fit the survival models using Bayesian estimation with expert opinion
```

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```
example1_bayes <- fit.models.expert(
  formula = Surv(time2, status2) ~ 1,
  data = data2,
  distr = c("wei", "gom"),
  method = "bayes",
  opinion_type = "survival",
  times_expert = timepoint_expert,
  param_expert = param_expert_example1,
  iter = 2000, # Set to a high number for convergence (e.g., 2000 or more)
  compile_mods = compiled_models_saved
)

# Summarize the Bayesian model results
summary(example1_bayes)

# Plot the Bayesian fitted survival curves
plot(example1_bayes, add.km = TRUE, t = 0:20)

## End(Not run)</pre>
```

make.surv

Engine for Probabilistic Sensitivity Analysis on the survival curves

## **Description**

Creates the survival curves for the fitted model(s) - Original code from survHE

#### Usage

```
make.surv(fit, mod = 1, t = NULL, newdata = NULL, nsim = 1, ...)
```

#### **Arguments**

fit

the result of the call to the fit.models function, containing the model fitting (and other relevant information)

mod

the index of the model. Default value is 1, but the user can choose which model fit to visualise, if the call to fit.models has a vector argument for distr (so many models are fitted & stored in the same object)

t

the time vector to be used for the estimation of the survival curve

newdata

a list (of lists), specifiying the values of the covariates at which the computation is performed. For example list(list(arm=0),list(arm=1)) will create two survival curves, one obtained by setting the covariate arm to the value 0 and the other by setting it to the value 1. In line with flexsurv notation, the user needs to either specify the value for *all* the covariates or for none (in which case, newdata=NULL, which is the default). If some value is specified and at least one of the covariates is continuous, then a single survival curve will be computed in correspondence of the average values of all the covariates (including the factors, which in this case are expanded into indicators).

model.fit.plot

nsim The number of simulations from the distribution of the survival curves. Default

at nsim=1, in which case uses the point estimate for the relevant distributional

parameters and computes the resulting survival curve

... Additional options

## Value

A list with survival times for the fitted models

## Author(s)

Gianluca Baio

#### References

Baio G (2020). "survHE: Survival Analysis for Health Economic Evaluation and Cost-Effectiveness Modeling." *Journal of Statistical Software*, **95**(14), 1–47. doi:10.18637/jss.v095.i14.

#### See Also

```
psa.plot(for example)
```

model.fit.plot

Graphical representation of the measures of model fitting based on Information Criteria

#### **Description**

Plots a summary of the model fit for all the models fitted.

## Usage

```
model.fit.plot(..., type = "dic")
```

## **Arguments**

... Optional inputs. Must include an expertsurv object.

type should the DIC, WAIC, PML be plotted (AIC, BIC also allowed but only valid

for frequentist approach).

#### Value

A plot with the relevant model fitting statistics plotted in order of fit.

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#### **Examples**

```
require("dplyr")
param_expert_example1 <- list()</pre>
param_expert_example1[[1]] <- data.frame(dist = c("norm"),</pre>
                                          wi = c(1), # Ensure Weights sum to 1
                                          param1 = c(0.1),
                                          param2 = c(0.05),
                                          param3 = c(NA))
timepoint_expert <- 14 # Expert opinion at t = 14
data2 <- expertsurv::data %>% rename(status = censored) %>%
mutate(time2 = ifelse(time > 10, 10, time),
status2 = ifelse(time> 10, 0, status))
example1 <- fit.models.expert(formula=Surv(time2,status2)~1,data=data2,</pre>
                               distr=c("wei", "gomp"),
                               method="mle",
                               pool_type = "linear pool",
                               opinion_type = "survival",
                               times_expert = timepoint_expert,
                               param_expert = param_expert_example1)
model.fit.plot(example1, type = "aic")
```

plot.expertsurv

Plot survival curves for the models fitted using fit.models

#### Description

Plot survival curves for the models fitted using fit.models

#### Usage

```
## S3 method for class 'expertsurv'
plot(...)
```

## **Arguments**

Must include at least one result object saved as the call to the fit.models function. May include other optional parameters. These include:

- add.km: Whether the KM curve should be added.
- newdata: Specifies a profile of covariates (in the list newdata). Other possibilities are additional (mainly graphical) options:
  - xlab: A string with the label for the x-axis (default = "time").
  - ylab: A string with the label for the y-axis (default = "Survival").

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 lab.profile: A (vector of) string(s) indicating the labels associated with the strata defining the different survival curves to plot. Defaults to the value used by the Kaplan Meier estimate given in fit.models.

- xlim: A vector determining the limits for the x-axis.
- colors: A vector of characters defining the colours in which to plot the different survival curves.
- lab.profile: A vector of characters defining the names of the models fitted.
- add.km: TRUE (whether to also add the Kaplan Meier estimates of the data).
- annotate: FALSE (whether to also add text to highlight the observed vs extrapolated data).
- legend.position: A vector of proportions to place the legend. Default to 'c(.75,.9)', which means 75% across the x-axis and 90% across the y-axis.
- legend.title: Suitable instructions to format the title of the legend; defaults to 'element\_text(size=15,face="bold")' but other arguments can be added (using 'ggplot' facilities).
- legend.text: Suitable instructions to format the text of the legend; defaults to 'element\_text(colour="black", size=14, face="plain")' but other arguments can be added (using 'ggplot' facilities).
- plot\_opinion: TRUE will provide an illustration of the expert opinion at each time-point.
- plot\_ci: Statistical uncertainty can be plotted using the plot\_ci = TRUE argument and by specifying nsim equal to the number of desired simulations (for Bayesian models, this must be less than the total number of simulations from the posterior). By default, the confidence/credible intervals are plotted as dashed lines. If an area/ribbon plot is preferred, set ci\_plot\_ribbon = TRUE.
- nsim: Even if statistical uncertainty is not required in the plots, it is recommended that nsim is set to a reasonable number. If nsim = 1 by default, the maximum likelihood estimates or the posterior mean of the parameters will be used to plot the results. In most cases, this should suffice (particularly for maximum likelihood). However, the expected survival estimated by the full sampling distribution may be different from the estimate at its expectation/maximum likelihood estimate.

#### Value

A ggplot2 object of the survival curves.

## Author(s)

Gianluca Baio

plot\_expert\_opinion

#### References

Baio G (2020). "survHE: Survival Analysis for Health Economic Evaluation and Cost-Effectiveness Modeling." *Journal of Statistical Software*, **95**(14), 1–47. doi:10.18637/jss.v095.i14.

#### See Also

```
fit.models.expert
```

#### **Examples**

```
require("dplyr")
param_expert_example1 <- list()</pre>
param_expert_example1[[1]] <- data.frame(dist = c("norm","t"),</pre>
                                           wi = c(0.5, 0.5), # Ensure Weights sum to 1
                                           param1 = c(0.1, 0.12),
                                           param2 = c(0.15, 0.5),
                                           param3 = c(NA,3))
timepoint_expert <- 14</pre>
data2 <- data %>% rename(status = censored) %>% mutate(time2 = ifelse(time > 10, 10, time),
                                                     status2 = ifelse(time> 10, 0, status))
example1_mle <- fit.models.expert(formula=Surv(time2, status2)~1, data=data2,</pre>
                                    distr=c("wph", "exp"),
                                    method="mle",
                                    pool_type = "log pool",
                                    opinion_type = "survival",
                                    times_expert = timepoint_expert,
                                    param_expert = param_expert_example1)
plot(example1_mle, add.km = TRUE, t = 0:30,plot_opinion = TRUE)
```

plot\_expert\_opinion

Plotting Pooled Expert Opinion

## **Description**

Returns a ggplot with the individual expert opinions along with the pooled distributions (both linear and logarithmic).

## Usage

```
plot_expert_opinion(
  object,
  xl_plt = NULL,
  xu_plt = NULL,
  weights = NULL,
  St_indic = 0
)
```

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## **Arguments**

| object   | Either a object of class elicitation (from SHELF) or a dataframe with parameters of the distribution (see Example below). |
|----------|---------------------------------------------------------------------------------------------------------------------------|
| xl_plt   | Optionally set the lower bound for the plot                                                                               |
| xu_plt   | Optionally set the upper bound for the plot                                                                               |
| weights  | A vector with the weight of each expert. If omitted, set to equal weights.                                                |
| St_indic | Set to 1 if you want to truncate the distributions to be between 0 and 1.                                                 |

## Value

A ggplot with pooled distributions.

## **Examples**

```
expert_df <- data.frame(dist = c("norm","t"), #Distribution Name  \begin{aligned}  &\text{wi = c(1/3,2/3), \#Expert weights} \\  &\text{param1 = c(0.3,0.40), \#Parameter 1} \\  &\text{param2 = c(0.05,0.05), \# Parameter 2} \\  &\text{param3 = c(NA,3)) \#Parameter 3: Only t-distribution} \end{aligned}
```

print.expertsurv

Print a summary of the survival model(s) fitted by fit.models

## **Description**

Prints the summary table for the model(s) fitted, with the estimate of the parameters - ported from survHE.

## Usage

```
## S3 method for class 'expertsurv'
print(x, mod = 1, ...)
```

## **Arguments**

| X   | the expertsurv object (the output of the call to fit.models)                                                                                                                                                                        |
|-----|-------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------|
| mod | is the index of the model. Default value is 1, but the user can choose which model fit to visualise, if the call to fit.models has a vector argument for distr (so many models are fitted & stored in the same object)              |
| ••• | additional options, including: digits = number of significant digits to be shown in the summary table (default = 6) original = a flag to say whether the <i>original</i> table from either flexsurv or rstan/JAGS should be printed |

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#### Value

Printed message (no object returned) providing estimates of the survival models.

## Author(s)

Gianluca Baio

#### References

Baio G (2020). "survHE: Survival Analysis for Health Economic Evaluation and Cost-Effectiveness Modeling." *Journal of Statistical Software*, **95**(14), 1–47. doi:10.18637/jss.v095.i14.

## **Examples**

```
require("dplyr")
param_expert_example1 <- list()</pre>
param_expert_example1[[1]] <- data.frame(dist = c("norm","t"),</pre>
                                            wi = c(0.5, 0.5), # Ensure Weights sum to 1
                                         param1 = c(0.1, 0.12),
                                        param2 = c(0.15, 0.5),
                                         param3 = c(NA,3))
timepoint_expert <- 14</pre>
data2 <- data %>% rename(status = censored) %>% mutate(time2 = ifelse(time > 10, 10, time),
                                                      status2 = ifelse(time> 10, 0, status))
mle = example1 <- fit.models.expert(formula=Surv(time2,status2)~1,data=data2,</pre>
                    distr=c("wph", "gomp"),
                    method="mle",
                    pool_type = "log pool",
                    opinion_type = "survival",
                    times_expert = timepoint_expert,
                    param_expert = param_expert_example1)
print(mle)
```

psa.plot

Graphical depiction of the probabilistic sensitivity analysis for the survival curves - ported from survHE

## **Description**

Plots the survival curves for all the PSA simulations. The function is actually deprecated - similar graphs can be obtained directly using the plot method (with options), which allows a finer depiction of the results.

## Usage

```
psa.plot(psa, ...)
```

psa.plot

## Arguments

| psa   | the result of the call to the function make.surv                                                                                                                         |
|-------|--------------------------------------------------------------------------------------------------------------------------------------------------------------------------|
| • • • | Optional graphical parameters, such as: $xlab = label$ for the x-axis $ylab = label$ for the y-axis $col = (vector)$ of colors for the lines to be plotted $alpha = the$ |
|       | level of transparency for the curves (default = $0.2$ )                                                                                                                  |

#### Value

ggplot2 object of the survival curve including parameter uncertainty

#### Author(s)

Gianluca Baio

#### References

Baio G (2020). "survHE: Survival Analysis for Health Economic Evaluation and Cost-Effectiveness Modeling." *Journal of Statistical Software*, **95**(14), 1–47. doi:10.18637/jss.v095.i14.

```
require("dplyr")
param_expert_example1 <- list()</pre>
param_expert_example1[[1]] <- data.frame(dist = c("norm","t"),</pre>
                                         wi = c(0.5,0.5), # Ensure Weights sum to 1
                                         param1 = c(0.1, 0.12),
                                          param2 = c(0.15, 0.5),
                                          param3 = c(NA,3))
timepoint_expert <- 14</pre>
data2 <- data %>% rename(status = censored) %>% mutate(time2 = ifelse(time > 10, 10, time),
                                                    status2 = ifelse(time> 10, 0, status))
example1 <- fit.models.expert(formula=Surv(time2,status2)~1,data=data2,</pre>
                              distr=c("wph", "gomp"),
                              method="mle",
                              pool_type = "log pool",
                              opinion_type = "survival";
                              times_expert = timepoint_expert,
                              param_expert = param_expert_example1)
p.mle = make.surv(example1,mod= 2,t = 1:30, nsim=1000) #Plot the Gompertz model
psa.plot(p.mle , name_labs = "PSA", labs = "Gompertz", col ="blue")
```

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summary.expertsurv

Prints a summary table for the distribution the mean survival time for a given model and data

## **Description**

Calculates the mean survival time as the area under the survival curve - ported from survHE

## Usage

```
## S3 method for class 'expertsurv'
summary(object, mod = 1, t = NULL, nsim = 1000, ...)
```

## **Arguments**

nsim

| object | a expertsurv object (resulting from the call to fit.models)                                                                                                                                                                                                                      |
|--------|----------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------|
| mod    | the model to be analysed (default = 1)                                                                                                                                                                                                                                           |
| t      | the vector of times to be used in the computation. Default = $NULL$ , which means the observed times will be used. NB: the vector of times should be: i) long enough so that $S(t)$ goes to 0; and ii) dense enough so that the approximation to the AUC is sufficiently precise |

the number of simulations from the survival curve distributions to be used (to

compute interval estimates)

... Additional options

#### Value

A list comprising of the following elements:

mean.surv A matrix with the simulated values for the mean survival times

tab A summary table

## Author(s)

Gianluca Baio

#### References

Baio G (2020). "survHE: Survival Analysis for Health Economic Evaluation and Cost-Effectiveness Modeling." *Journal of Statistical Software*, **95**(14), 1–47. doi:10.18637/jss.v095.i14.

#### See Also

```
fit.models.expert, make.surv
```

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