# Package ' $\mathbf{C B S r}$ ' 

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Type PackageTitle Fits Cubic Bezier Spline Functions to Intertemporal and RiskyChoice Data
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Description Uses monotonically constrained Cubic Bezier Splines (CBS) to approximate latent util-ity functions in intertemporal choice and risky choice data. For more informa-tion, see Lee, Glaze, Bradlow, and Kable [doi:10.1007/s11336-020-09723-4](doi:10.1007/s11336-020-09723-4).
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R topics documented:
CBSfunc ..... 2
CBS_ITC ..... 2
CBS_RC ..... 4
ITCdat ..... 5
RCdat ..... 6
Index ..... 7

```
CBSfunc CBSfunc
```


## Description

Calculate either the Area Under the Curve (AUC) of a CBS function, or calculate the y coordinates of CBS function given $x$.

```
Usage
    CBSfunc(xpos, ypos, x = NULL)
```


## Arguments

xpos Vector of real numbers of length $1+3 n(n=1,2,3, \ldots)$, corresponding to Bezier points' x-coordinates of a CBS function
ypos Vector of real numbers of length $1+3 n(n=1,2,3, \ldots)$, corresponding to Bezier points' y-coordinates of a CBS function
$x \quad$ Vector of real numbers, corresponding to $x$-coordinates of a CBS function. Default value is Null.

## Value

If $x$ is provided, return $y$ coordinates corresponding to $x$. If $x$ is not provided, return AUC.

## Examples

$\operatorname{CBSfunc}(c(0,0.3,0.6,1), c(0.5,0.2,0.7,0.9))$
CBSfunc $(c(0,0.3,0.6,1), c(0.5,0.2,0.7,0.9)$, seq $(0,1,0.1))$

```
CBS_ITC
CBS_ITC
```


## Description

Fit either a 1-piece or 2-piece CBS latent utility function to binary intertemporal choice data.

## Usage

CBS_ITC(choice, Amt1, Delay1, Amt2, Delay2, numpiece, numfit = NULL)

## Arguments

| choice | Vector of 0 s and 1 s .1 if the choice was option 1,0 if the choice was option 2. |
| :--- | :--- |
| Amt1 | Vector of positive real numbers. Reward amount of choice 1. |
| Delay1 | Vector of positive real numbers. Delay until the reward of choice 1. |
| Amt2 | Vector of positive real numbers. Reward amount of choice 2. |
| Delay2 | Vector of positive real numbers. Delay until the reward of choice 2. |
| numpiece | Either 1 or 2. Number of CBS pieces to use. |
| numfit | Number of model fits to perform from different starting points. If not provided, <br> numfit $=10 *$ numpiece |

## Details

The input data has $n$ choices (ideally $\mathrm{n}>100$ ) between two reward options. Option 1 is receiving Amt1 in Delay1 and Option 2 is receiving Amt2 in Delay2 (e.g., $\$ 40$ in 20 days vs. $\$ 20$ in 3 days). One of the two options may be immediate (i.e., delay $=0$; e.g., $\$ 40$ in 20 days vs. $\$ 20$ today). choice should be 1 if option 1 is chosen, 0 if option 2 is chosen.

## Value

A list containing the following:

- type: either 'CBS1' or 'CBS2' depending on the number of pieces
- LL: log likelihood of the model
- numparam: number of total parameters in the model
- scale: scaling factor of the logit model
- xpos: x coordinates of the fitted CBS function
- ypos: y coordinates of the fitted CBS function
- AUC: area under the curve of the fitted CBS function. Normalized to be between 0 and 1 .
- normD : The domain of CBS function runs from 0 to normD. Specifically, this is the constant used to normalize all delays between 0 and 1 , since CBS is fitted in a unit square first and then scaled up.


## Examples

```
# Fit example ITC data with 2-piece CBS function.
# Load example data (included with package).
# Each row is a choice between option 1 (Amt at Delay) vs option 2 (20 now).
Amount1 = ITCdat$Amt1
Delay1 = ITCdat$Delay1
Amount2 = 20
Delay2 = 0
Choice = ITCdat$Choice
# Fit the model
out = CBS_ITC(Choice,Amount1,Delay1,Amount2,Delay2,2)
```

```
# Plot the choices (x = Delay, y = relative amount : 20 / delayed amount)
plot(Delay1[Choice==1],20/Amount1[Choice==1],type = 'p',col="blue",xlim=c(0, 180), ylim=c(0, 1))
points(Delay1[Choice==0], 20/Amount1[Choice==0],type = 'p',col="red")
# Plot the fitted CBS
x = 0:out$normD
lines(x,CBSfunc(out$xpos,out$ypos,x), col="black")
```

CBS_RC $C B S \_R C$

## Description

Fit either a 1-piece or 2-piece CBS latent utility function to binary risky choice data.

## Usage

CBS_RC(choice, Amt1, Prob1, Amt2, Prob2, numpiece, numfit = NULL)

## Arguments

choice $\quad$ Vector of 0 s and 1 s .1 if the choice was option 1,0 if the choice was option 2.
Amt1 Vector of positive real numbers. Reward amount of choice 1.
Prob1 Vector of positive real numbers between 0 and 1 . Probability of winning the reward of choice 1.

Amt2 Vector of positive real numbers. Reward amount of choice 2.
Prob2 Vector of positive real numbers between 0 and 1 . Probability of winning the reward of choice 2.
numpiece $\quad$ Either 1 or 2 . Number of CBS pieces to use.
numfit Number of model fits to perform from different starting points. If not provided, numfit $=10^{*}$ numpiece

## Details

The input data has $n$ choices (ideally $n>100$ ) between two reward options. Option 1 is receiving Amt1 with probability Prob1 and Option 2 is receiving Amt2 with probability Prob2 (e.g., $\$ 40$ with $53 \%$ chance vs. $\$ 20$ with $90 \%$ chance). One of the two options may be certain (i.e., prob $=1$; e.g., $\$ 40$ with $53 \%$ chance vs. $\$ 20$ for sure). choice should be 1 if option 1 is chosen, 0 if option 2 is chosen.

## Value

A list containing the following:

- type: either 'CBS1' or 'CBS2' depending on the number of pieces
- LL: log likelihood of the model
- numparam: number of total parameters in the model
- scale: scaling factor of the logit model
- xpos: x coordinates of the fitted CBS function
- ypos: y coordinates of the fitted CBS function
- AUC: area under the curve of the fitted CBS function. Normalized to be between 0 and 1 .


## Examples

```
\# Fit example Risky choice data with 2-piece CBS function.
\# Load example data (included with package).
\# Each row is a choice between option 1 (Amt with prob) vs option 2 (20 for 100\%).
Amount1 = RCdat\$Amt1
Prob1 = RCdat\$Prob1
Amount2 \(=20\)
Prob2 \(=1\)
Choice \(=\) RCdat\$Choice
\# Fit the model
out = CBS_RC(Choice,Amount1,Prob1,Amount2,Prob2,2)
\# Plot the choices ( \(x=\) Delay, \(y=\) relative amount : 20 / risky amount)
plot(Prob1[Choice==1],20/Amount1[Choice==1], type = 'p', col="blue", xlim=c(0, 1), ylim=c(0, 1))
points(Prob1[Choice==0],20/Amount1[Choice==0],type = 'p',col="red")
\# Plot the fitted CBS
\(x=\operatorname{seq}(0,1, .01)\)
lines(x,CBSfunc(out\$xpos,out\$ypos,x))
```

ITCdat $\quad$| Sample participant data from a binary intertemporal choice task (aka |
| :--- |
| delay discounting task) |

## Description

A dataset containing one sample participant's 120 binary choices between a delayed monetary option (Amt1 in Delay1) and a immediate monetary option (\$20 now). The immediate monetary option was always '\$20 now' across all trials

## Usage

ITCdat

## Format

A data frame with 120 rows and 3 variables:
Amt1 Delayed reward amount, in dollars
Delay1 Delay until the receipt of Amt1, in days

Choice Choice between binary options. Choice $==1$ means participnat chose the delayed option (i.e., Amt1 in Delay1 days). Choice $==0$ means participnat chose the immediate option (i.e., \$20 now)

## Source

Kable, J. W., Caulfield, M. K., Falcone, M., McConnell, M., Bernardo, L., Parthasarathi, T., ... \& Diefenbach, P. (2017). No effect of commercial cognitive training on brain activity, choice behavior, or cognitive performance. Journal of Neuroscience, 37(31), 7390-7402.

RCdat Sample participant data from a binary risky choice task (aka risk aversion task)

## Description

A dataset containing one sample participant's 120 binary choices between a probabilistic monetary option (Amt1 with Prob1 chance of winning) and a certain monetary option ( $\$ 20$ for sure). The certain monetary option was always ' $\$ 20$ for sure' across all trials

## Usage

RCdat

## Format

A data frame with 120 rows and 3 variables:
Amt1 Probabilistic reward amount, in dollars
Prob1 Probability of winning Amt1, if it were to be chosen
Choice Choice between binary options. Choice==1 means participnat chose the probabilistic option (i.e., Amt1 with Delay1 chance of winning). Choice $=0$ means participnat chose the certain option (i.e., $\$ 20$ for sure)

## Source

Kable, J. W., Caulfield, M. K., Falcone, M., McConnell, M., Bernardo, L., Parthasarathi, T., ... \& Diefenbach, P. (2017). No effect of commercial cognitive training on brain activity, choice behavior, or cognitive performance. Journal of Neuroscience, 37(31), 7390-7402.

## Index

* datasets

ITCdat, 5
RCdat, 6
CBS_ITC, 2
CBS_RC, 4
CBSfunc, 2
ITCdat, 5
RCdat, 6

