

# Package ‘MplusTrees’

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**Type** Package

**Title** Decision Trees with Structural Equation Models Fit in 'Mplus'

**Version** 0.2.3

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**Depends** R (>= 2.10), rpart, MplusAutomation

**Imports** nlme, rpart.plot

**Suggests** lavaan

**Description**

Uses recursive partitioning to create homogeneous subgroups based on structural equation models fit in 'Mplus', a stand-alone program developed by Muthen and Muthen.

**SystemRequirements** 'Mplus' (<<http://www.statmodel.com>>)

**License** GPL

**Encoding** UTF-8

**RoxygenNote** 7.3.2

**NeedsCompilation** no

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**Repository** CRAN

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causalmp

*Causal Mplus Trees***Description**

Uses *Mplus Trees* to match on structural equation model parameters in matching subsample. Then estimates Conditional Average Treatment Effects (CATEs) in holdout estimation subsample.

**Usage**

```
causalmp(
  script,
  data,
  rPartFormula,
  group = ~id,
  treat,
  outcome,
  est.samp = 0.2,
  ...
)
```

**Arguments**

<code>script</code>	An <code>MplusAutomation</code> script file
<code>data</code>	Dataset that is specified in the script
<code>rPartFormula</code>	Formula of the form <code>~ variable names</code>
<code>group</code>	id variable. If not specified an id variable is created for each row
<code>treat</code>	Treatment variable
<code>outcome</code>	Univariate outcome of interest (dependent variable in mean comparison tests)
<code>est.samp</code>	Proportion of sample to be used as holdout sample (estimation subsample)
<code>...</code>	Other arguments to <code>MplusTrees</code> for building <code>Mplus Tree</code>

**Details**

See documentation for `MplusTrees()` for further information on tree building process. Takes terminal nodes from `Mplus Tree` and considers them "matched". Splits estimation subsample into groups defined by covariate pattern in terminal nodes from `Mplus Tree`. Performs t tests in each group with `treat` as independent variable and `outcome` as dependent variable to estimate CATEs. Also performs ANOVA to determine if treatment effect differs by group (interaction).

**Value**

An object of class `'causalmp'`. Tree structure drawn from `MplusTrees()`. CATEs estimated in estimation (holdout) subsample. Provides results of t tests to estimate CATEs in each group and ANOVA to examine group differences in treatment effect.

**Author(s)**

Sarfraz Serang

**References**

Serang, S., & Sears, J. (2021). Tree-based matching on structural equation model parameters. *Behavioral Data Science*, 1, 31-53.

**Examples**

```
## Not run:
library(lavaan)

script = mplusObject(
  TITLE = "Causal Mplus Trees Example",
  MODEL = "f1 BY x1-x3;",
  usevariables = c('x1', 'x2', 'x3'),
  rdata = HolzingerSwineford1939)

fit.cmpt = causalmpmt(script, HolzingerSwineford1939, group=~id,
  rPartFormula=~school+grade,
  control=rpart.control(minsplit=100, minbucket=100, cp=.01),
  treat="sex", outcome="x4")
fit.cmpt

## End(Not run)
```

---

MplusTrees

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*Recursive partitioning trees with Mplus models*


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**Description**

Generates recursive partitioning trees using *Mplus* models. `MplusTrees()` takes an *Mplus* model written in the form of an `MplusAutomation` script, uses `MplusAutomation` to fit the model in *Mplus*, and performs recursive partitioning using `rpart`.

**Usage**

```
MplusTrees(
  script,
  data,
  rPartFormula,
  catvars = NULL,
  group = ~id,
  control = rpart.control(),
  se = F,
  psplit = F,
  palpha = 0.05,
```

```

    cv = F,
    k = 5
)

```

### Arguments

<code>script</code>	An MplusAutomation script file
<code>data</code>	Dataset that is specified in the script
<code>rPartFormula</code>	Formula of the form <code>~ variable names</code>
<code>catvars</code>	Vector of names of categorical covariates
<code>group</code>	id variable. If not specified an id variable is created for each row
<code>control</code>	Control object for <code>rpart</code>
<code>se</code>	Whether to print standard errors and $p$ values. In general should be set to FALSE
<code>psplit</code>	Whether to use likelihood ratio $p$ values as a splitting criterion
<code>palpha</code>	Type I error rate (alpha level) for rejecting with likelihood ratio test when <code>psplit</code> set to TRUE
<code>cv</code>	Performs k-fold cross-validation to select value of <code>cp</code>
<code>k</code>	number of folds for cross-validation

### Details

The function temporarily changes the working directory to the temporary directory. Files used and generated by *Mplus* are stored here and can be accessed using `tempdir()`.

By default `MplusTrees()` only splits on the criteria specified in the `control` argument, the most important of which is the `cp` parameter. The user can also split on the  $p$  value generated from the likelihood ratio test comparing the parent node to a multiple group model consisting of 2 groups (the daughter nodes). This  $p$  value criterion is used in addition to the `cp` criterion in that both must be met for a split to be made. The `psplit` argument turns this option on, and `palpha` sets the alpha level criterion for rejection.

Cross-validation (CV) can also be used to choose the `cp` parameter. If this option is used, any user-specified `cp` value will be overridden by the optimal `cp` value chosen by CV. CV fits the model to the training set and calculates an expected minus 2 log-likelihood (-2LL) for each terminal node. In the test set, individuals are assigned to terminal nodes based on the tree structure found in the training set. Their "expected" values are the -2LL values from the respective training set terminal nodes. The "observed" values are the -2LL values from fitting a multiple group model, with each terminal node as a group. The `cp` value chosen is the one that produces the smallest MSE.

CV should only be used when (1) the *Mplus* model can be fit relatively quickly, (2) there are only a few covariates with a few response options, and (3) the sample size is large enough that the user is confident the model can be fit without issue in a sample of size  $N/k$  and a tree that partitions this sample further. If these conditions are not met, the process could take prohibitively long to arrive at a solution. Note that if even a single model fails to produce a valid log-likelihood value, the function will terminate with an error.

**Value**

An object of class 'mplustree'. rpart\_out provides the tree structure, terminal gives a vector of terminal nodes, where shows the terminal node of each id, and estimates gives the parameter estimates for each terminal node.

**Author(s)**

Ross Jacobucci and Sarfaraz Serang

**References**

Serang, S., Jacobucci, R., Stegmann, G., Brandmaier, A. M., Cuianos, D., & Grimm, K. J. (2021). Mplus Trees: Structural equation model trees using Mplus. *Structural Equation Modeling*, 28, 127-137.

**Examples**

```
## Not run:
library(lavaan)

script = mplusObject(
  TITLE = "Example #1 - Factor Model;",
  MODEL = "f1 BY x1-x3; f2 BY x4-x6; f3 BY x7-x9;",
  usevariables = c('x1', 'x2', 'x3', 'x4', 'x5', 'x6', 'x7', 'x8', 'x9'),
  rdata = HolzingerSwineford1939)

fit = MplusTrees(script, HolzingerSwineford1939, group=~id,
  rPartFormula=~sex+school+grade,
  control=rpart.control(minsplit=100, minbucket=100, cp=.01))

fit

## End(Not run)
```

---

plot.mplustree

*Plots tree structure of an Mplus Tree*

---

**Description**

Wrapper using rpart.plot package to plot the tree structure of a fitted Mplus Tree.

**Usage**

```
## S3 method for class 'mplustree'
plot(x, ...)
```

**Arguments**

x                    An object of class "mplustree" (a fitted Mplus Tree)  
 ...                  Other arguments passed to rpart.plot

**Details**

Each node of the plot by default contain the -2 log-likelihood (deviance), the number of individuals in the node, and the percentage of the total sample in the node.

**Author(s)**

Sarfaraz Serang, relying heavily on the rpart.plot package by Stephen Milborrow.

**Examples**

```
## Not run:
library(lavaan)

script = mplusObject(
  TITLE = "Example #1 - Factor Model;",
  MODEL = "f1 BY x1-x3; f2 BY x4-x6; f3 BY x7-x9;",
  usevariables = c('x1', 'x2', 'x3', 'x4', 'x5', 'x6', 'x7', 'x8', 'x9'),
  rdata = HolzingerSwineford1939)

fit = MplusTrees(script, HolzingerSwineford1939, group=~id,
  rPartFormula=~sex+school+grade, control=rpart.control(cp=.01))

fit

plot(fit)

## End(Not run)
```

---

summary.mplustree

*Summarizing MplusTrees model Fits*


---

**Description**

summary method for class "mplustree".

**Usage**

```
## S3 method for class 'mplustree'
summary(object, ...)
```

**Arguments**

object                An object of class "mplustree" (a fitted Mplus Tree)  
 ...                    Other arguments passed to or from other methods

## Details

Prints the tree structure given in object

## Examples

```
## Not run:
library(lavaan)

script = mplusObject(
  TITLE = "Example #1 - Factor Model;",
  MODEL = "f1 BY x1-x3; f2 BY x4-x6; f3 BY x7-x9;",
  usevariables = c('x1', 'x2', 'x3', 'x4', 'x5', 'x6', 'x7', 'x8', 'x9'),
  rdata = HolzingerSwineford1939)

fit = MplusTrees(script, HolzingerSwineford1939, group=~id,
  rPartFormula=~sex+school+grade, control=rpart.control(cp=.01))

summary(fit)

## End(Not run)
```

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