

# Package ‘TSDFGS’

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**Title** Training Set Determination for Genomic Selection

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**Description** Determining training set for genomic selection using a genetic algorithm (Holland J.H. (1975) <DOI:10.1145/1216504.1216510>) or simple exchange algorithm (change an individual every iteration). Three different criteria are used in both algorithms, which are r-score (Ou J.H., Liao C.T. (2018) <DOI:10.6342/NTU201802290>), PEV-score (Akdemir D. et al. (2015) <DOI:10.1186/s12711-015-0116-6>) and CD-score (Laloe D. (1993) <DOI:10.1186/1297-9686-25-6-557>). Phenotypic data for candidate set is not necessary for all these methods. By using it, one may readily determine a training set that can be expected to provide a better training set comparing to random sampling.

**URL** <https://tsdfgs.oumark.me>

**BugReports** <https://gitlab.com/oumark/TSDFGS/issues>

**License** GPL (>= 3)

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**LinkingTo** Rcpp, RcppEigen

**NeedsCompilation** yes

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TSDFGS-package

*Training Set Determination for Genomic Selection*


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## Description

Determining training set for genomic selection using a genetic algorithm (Holland J.H. (1975) <DOI:10.1145/1216504.1216510>) or simple exchange algorithm (change an individual every iteration). Three different criteria are used in both algorithms, which are r-score (Ou J.H., Liao C.T. (2018) <DOI:10.6342/NTU201802290>), PEV-score (Akdemir D. et al. (2015) <DOI:10.1186/s12711-015-0116-6>) and CD-score (Laloe D. (1993) <DOI:10.1186/1297-9686-25-6-557>). Phenotypic data for candidate set is not necessary for all these methods. By using it, one may readily determine a training set that can be expected to provide a better training set comparing to random sampling.

## Details

The package is used to determine the optimal training set in a highly structured, mild structured and diverse population. The function "optTrain" use a genetic algorithm or simple exchange algorithm to evaluate an optimal solution using one of the criteria (r-score (Ou J.H., Liao C.T. (2018) <DOI:10.6342/NTU201802290>), PEV-score (Akdemir D. et al. (2015) <DOI:10.1186/s12711-015-0116-6>), CD-score(Laloe D. (1993) <DOI:10.1186/1297-9686-25-6-557>)).

## Author(s)

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## References

Akdemir D., Sanchez JI., Jannink JL. (2015), Optimization of genomic selection training populations with a genetic algorithm. *Genetic Selection Evolution* 47:38.\

Laloe D. (1993), Precision and information in linear models of genetic evolution. *Genetics Selection Evolution* 25:557.\

Ou J.H., Liao C.T. (2018), Training set determination for genomic selection. National Taiwan University Master Thesis.

## See Also

[STPGA](#)

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cd_score	<i>Generalized Coefficient of Determination</i>
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**Description**

A criterion for finding optimal training set using generalized coefficient of determination (Laloe D. (1993) <DOI:10.1186/1297-9686-25-6-557>).

**Usage**

```
cd_score(x, x0)
```

**Arguments**

x	Genomic matrix of training set.
x0	Genomic metric of testing set.

**Value**

A numeric score.

**Author(s)**

Jen-Hsiang Ou <oumark.me@outlook.com>

**References**

Laloe D. (1993), Precision and information in linear models of genetic evaluation. *Genetics Selection Evolution* 25:557.

**Examples**

```
data("rice44kPCA")
cd_score(geno[1:100,], geno[101:200,])
```

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geno	<i>Rice 44k Genomoe Data</i>
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**Description**

A PC Matric of Rice 44k Genomoe Data

**Usage**

```
data("rice44kPCA")
```

**Format**

A numeric matrix with 404 rows and 404 columns.

**Source**

<http://www.ricediversity.org/data/index.cfm>

**Examples**

```
data("rice44kPCA")
dim(geno)
```

---

optTrain

*Algorithm for optimal training set determination*

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**Description**

It uses a genetic algorithm or simple exchange algorithm with three different criteria (r-score (J.H. Ou et al., (2019) <DOI:10.6342/NTU201802290>), PEV-score (Akdemir D. et al., (2015) <DOI:10.1186/s12711-015-0116-6>), CD-score (Laloe D. (1993) <DOI:10.1186/1297-9686-25-6-557>)) to determine an optimal training set.

**Usage**

```
optTrain(geno, cand, n.train, subpop = NULL,
         test = NULL, method = "rScore", min.iter = NULL)
```

**Arguments**

geno	A numeric matrix of principal components (rows: individuals; columns: PCs). To reduce computing time, one may use first k PCs by <code>geno[,1:k]</code> .
cand	An integer vector of which rows of individuals are candidates of the training set in the <code>geno</code> matrix.
n.train	The size of the target training set.
subpop	A character vector of subpopulation's group name. The algorithm will ignore the population structure if it remains <code>NULL</code> .
test	An integer vector of which rows of individuals are in the test set in the <code>geno</code> matrix. The algorithm will use an un-target method if it remains <code>NULL</code> .
method	Choices are <code>rScore</code> , <code>PEV</code> and <code>CD</code> . <code>rScore</code> will be used by default.
min.iter	Minimum iteration of all methods can be appointed. One should always check if the algorithm is converged or not. A minimum iteration will set by considering the candidate and test set size if it remains <code>NULL</code> .

**Value**

OPTtrain	An integer vector of the chosen optimal training set.
TOPscore	Score of each iteration. (Given by one of three criterions)
ITERScore	Score of the best solution in by far. (Given by one of three criterions.)

**Note**

Both genetic algorithm and simple exchange algorithms do not assure convergence to global optimal, and it is highly recommended to draw the convergence plot to check it converges to the local optimal.

**Author(s)**

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**References**

Akdemir D., Sanchez JI., Jannink JL. (2015), Optimization of genomic selection training populations with a genetic algorithm. *GenSetic Selection Evolution* 47:38.\

Laloe D. (1993), Precision and information in linear models of genetic evolution. *Genetics Selection Evolution* 25:557.\

Holland J. H. (1975) *Adaptation in Natural and Artificial Systems*. University of Michigan Press.

**Examples**

```
## LOAD EXAMPLE DATA ##
data("rice44kPCA")
out.RNN = optTrain(geno, cand = 1:404, n.train = 100)
```

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pev\_score

*PEV Score*

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**Description**

PEV-score (Akdemir D. et al. (2015) <DOI:10.1186/s12711-015-0116-6>) is a criterion for finding a training set which derived from the covariance of the prediction of the test set.

**Usage**

```
pev_score(X, X0)
```

**Arguments**

X A genetic matrix of training set.  
X0 A genetic matrix of test set.

**Value**

A numeric score.

**Author(s)**

Jen-Hsiang Ou <oumark.me@outlook.com>

**References**

Akdemir D. et al., (2015), Optimization of genomic selection training populations with a genetic algorithm. *Genetics Selection Evolution* 47:38.\

Kennedy B.W., Trus D., (1993), Considerations on genetic connectedness between management units under an animal model. *J Anim Sci.* 1993 Sep;71(9):2341-52

**Examples**

```
data("rice44kPCA")
pev_score(geno[1:50,], geno[51:100,])
```

---

rice44kPCA	<i>44k genome rice data</i>
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**Description**

This data set was provided by Zhao et al. (2011) <DOI:10.1038/ncomms1467> which genotyping 44,100 SNP variants across 413 diverse accessions of *O. sativa* from 82 countries. We converted the genomic information into a PC matrix.

**Usage**

```
data("rice44kPCA")
```

**Format**

geno A numeric matrix of principal components  
subpop A character vector of subpopulation's group name.

**Source**

<http://www.ricediversity.org/data/index.cfm>

## References

Keyan Zhao, Chih-Wei Tung, Georgia C. Eizenga, Mark H. Wright, M. Liakat Ali, Adam H. Price, Gareth J. Norton, M. Rafiqul Islam, Andy Reynolds, Jason Mezey, Anna M. McClung, Carlos D. Bustamante & Susan R. McCouch (2011). Genome-wide association mapping reveals a rich genetic architecture of complex traits in *Oryza sativa*. *Nat Comm* 2:467 | DOI: 10.1038/ncomms1467, Published Online 13 Sep 2011.

## Examples

```
data("rice44kPCA")
```

---

r_score	<i>r Score</i>
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## Description

A criterion for finding training set which derived from Pearson's correlation between GEBVs (genomic estimated breeding value) and phenotype value of a test set.

## Usage

```
r_score(x, x0)
```

## Arguments

x	A genetic matrix of training set.
x0	A genetic matrix of test set.

## Value

A numeric score.

## Author(s)

Jen-Hsiang Ou <oumark.me@outlook.com>

## References

Ou J.H., Liao C.T. (2018), Training set determination for genomic selection. National Taiwan University Master Thesis.

## Examples

```
data("rice44kPCA")
r_score(geno[1:50,], geno[51:100,])
```

---

subpop

*Rice 44k Genome Data*

---

**Description**

Subpopulation of Each Individuals in Rice 44k Genome Data

**Usage**

```
data("rice44kPCA")
```

**Format**

A character vector.

**Source**

<http://www.ricediversity.org/data/index.cfm>

**Examples**

```
data("rice44kPCA")  
print(subpop)
```



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