## Package: powerEQTL (via r-universe)

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Type Package

Title Power and Sample Size Calculation for eQTL Analysis

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Author Xianjun Dong [aut, ctb], Tzuu-Wang Chang [aut, ctb], Scott T. Weiss [aut, ctb], Weiliang Qiu [aut, cre]

Maintainer Weiliang Qiu <stwxq@channing.harvard.edu>

**Depends** R (>= 3.3.0)

Imports stats, powerMediation

**Description** Power and sample size calculation for eQTL analysis based on ANOVA or simple linear regression. It can also calculate power/sample size for testing the association of a SNP to a continuous type phenotype.

License GPL (>=2)

URL https://github.com/sterding/powerEQTL

LazyData TRUE

NeedsCompilation no

Repository https://sterding.r-universe.dev

RemoteUrl https://github.com/sterding/powereqtl

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## minEffectEQTL.ANOVA Calculation of Minimum Detectable Effect Size for EQTL Analysis Based on Un-Balanced One-Way ANOVA

## Description

Calculation of minimum detectable effect size  $(\delta/\sigma)$  for eQTL analysis that tests if a SNP is associated to a gene probe by using un-balanced one-way ANOVA.

#### Usage

## Arguments

MAF	Minor allele frequency.
typeI	Type I error rate for testing if a SNP is associated to a gene probe.
nTests	integer. Number of tests in eQTL analysis.
myntotal	integer. Number of subjects.
mypower	Desired power for the eQTL analysis.
verbose	logic. indicating if intermediate results should be output.

#### Details

The assumption of the ANOVA approach is that the association of a SNP to a gene probe is tested by using un-balanced one-way ANOVA (e.g. Lonsdale et al. 2013). According to SAS online document https://support.sas.com/documentation/cdl/en/statug/63033/HTML/default/viewer. htm#statug\_power\_a0000000982.htm, the power calculation formula is

 $power = Pr(F \ge F_{1-\alpha}(k-1, N-k) | F \sim F_{k-1, N-k, \lambda}),$ 

where k = 3 is the number of groups of subjects, N is the total number of subjects,  $F_{1-\alpha}(k-1, N-k)$  is the  $100(1-\alpha)$ -th percentile of central F distribution with degrees of freedoms k-1 and N-k,

and  $F_{k-1,N-k,\lambda}$  is the non-central F distribution with degrees of freedoms k-1 and N-k and non-central parameter (ncp)  $\lambda$ . The ncp  $\lambda$  is equal to

$$\lambda = \frac{N}{\sigma^2} \sum_{i=1}^{k} w_i \left(\mu_i - \mu\right)^2,$$

where  $\mu_i$  is the mean gene expression level for the *i*-th group of subjects,  $w_i$  is the weight for the *i*-th group of subjects,  $\sigma^2$  is the variance of the random errors in ANOVA (assuming each group has equal variance), and  $\mu$  is the weighted mean gene expression level

$$\mu = \sum_{i=1}^k w_i \mu_i.$$

The weights  $w_i$  are the sample proportions for the 3 groups of subjects. Hence,  $\sum_{i=1}^{3} w_i = 1$ .

We assume that  $\mu_2 - \mu_1 = \mu_3 - \mu_2 = \delta$ , where  $\mu_1, \mu_2$ , and  $\mu_3$  are the mean gene expression level for mutation homozygotes, heterozygotes, and wild-type homozygotes, respectively.

Denote p as the minor allele frequency (MAF) of a SNP. Under Hardy-Weinberg equilibrium, we have genotype frequencies:  $p_2 = p^2$ ,  $p_1 = 2pq$ , and  $p_0 = q^2$ , where  $p_2$ ,  $p_1$ , and  $p_0$  are genotype for mutation homozygotes, heterozygotes, and wild-type homozygotes, respectively, q = 1 - p. Then ncp can be simplified as

$$ncp = 2pqN\left(\frac{\delta}{\sigma}\right)^2,$$

#### Value

minimum detectable effect size  $\delta/\sigma$ .

## Author(s)

Xianjun Dong <XDONG@rics.bwh.harvard.edu>, Tzuu-Wang Chang <Chang.Tzuu-Wang@mgh.harvard.edu>, Scott T. Weiss <restw@channing.harvard.edu>, Weiliang Qiu <stwxq@channing.harvard.edu>

#### References

Lonsdale J and Thomas J, et al. The Genotype-Tissue Expression (GTEx) project. Nature Genetics, 45:580-585, 2013.

#### See Also

powerEQTL.ANOVA, powerEQTL.ANOVA2, ssEQTL.ANOVA, ssEQTL.ANOVA2

#### Examples

```
mypower = 0.8,
verbose = TRUE)
```

minMAFeQTL.ANOVA Calculation of Minimum Detectable Minor Allele Frequency for EQTL Analysis Based on Un-Balanced One-Way ANOVA

## Description

Calculation of minimum detectable minor allele frequency (MAF) for eQTL analysis that tests if a SNP is associated to a gene probe by using un-balanced one-way ANOVA.

## Usage

```
minMAFeQTL.ANOVA(effsize,
    typeI = 0.05,
    nTests = 200000,
    myntotal = 200,
    mypower = 0.8,
    verbose = TRUE)
```

#### Arguments

effsize	Effect size $\delta/\sigma$ .
typeI	Type I error rate for testing if a SNP is associated to a gene probe.
nTests	integer. Number of tests in eQTL analysis.
myntotal	integer. Number of subjects.
mypower	Desired power for the eQTL analysis.
verbose	logic. indicating if intermediate results should be output.

#### Details

The assumption of the ANOVA approach is that the association of a SNP to a gene probe is tested by using un-balanced one-way ANOVA (e.g. Lonsdale et al. 2013). According to SAS online document https://support.sas.com/documentation/cdl/en/statug/63033/HTML/default/viewer. htm#statug\_power\_a0000000982.htm, the power calculation formula is

$$power = Pr(F \ge F_{1-\alpha}(k-1, N-k) | F \sim F_{k-1, N-k, \lambda}),$$

where k = 3 is the number of groups of subjects, N is the total number of subjects,  $F_{1-\alpha} (k-1, N-k)$ is the  $100(1-\alpha)$ -th percentile of central F distribution with degrees of freedoms k-1 and N-k, and  $F_{k-1,N-k,\lambda}$  is the non-central F distribution with degrees of freedoms k-1 and N-k and non-central parameter (ncp)  $\lambda$ . The ncp  $\lambda$  is equal to

$$\lambda = \frac{N}{\sigma^2} \sum_{i=1}^{k} w_i \left(\mu_i - \mu\right)^2,$$

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where  $\mu_i$  is the mean gene expression level for the *i*-th group of subjects,  $w_i$  is the weight for the *i*-th group of subjects,  $\sigma^2$  is the variance of the random errors in ANOVA (assuming each group has equal variance), and  $\mu$  is the weighted mean gene expression level

$$\mu = \sum_{i=1}^k w_i \mu_i.$$

The weights  $w_i$  are the sample proportions for the 3 groups of subjects. Hence,  $\sum_{i=1}^{3} w_i = 1$ .

We assume that  $\mu_2 - \mu_1 = \mu_3 - \mu_2 = \delta$ , where  $\mu_1, \mu_2$ , and  $\mu_3$  are the mean gene expression level for mutation homozygotes, heterozygotes, and wild-type homozygotes, respectively.

Denote p as the minor allele frequency (MAF) of a SNP. Under Hardy-Weinberg equilibrium, we have genotype frequencies:  $p_2 = p^2$ ,  $p_1 = 2pq$ , and  $p_0 = q^2$ , where  $p_2$ ,  $p_1$ , and  $p_0$  are genotype for mutation homozygotes, heterozygotes, and wild-type homozygotes, respectively, q = 1 - p. Then ncp can be simplified as

$$ncp = 2pqN\left(\frac{\delta}{\sigma}\right)^2,$$

#### Value

minimum detectable MAF.

#### Author(s)

Xianjun Dong <XDONG@rics.bwh.harvard.edu>, Tzuu-Wang Chang <Chang.Tzuu-Wang@mgh.harvard.edu>, Scott T. Weiss <restw@channing.harvard.edu>, Weiliang Qiu <stwxq@channing.harvard.edu>

#### References

Lonsdale J and Thomas J, et al. The Genotype-Tissue Expression (GTEx) project. Nature Genetics, 45:580-585, 2013.

#### See Also

powerEQTL.ANOVA, powerEQTL.ANOVA2, ssEQTL.ANOVA, ssEQTL.ANOVA2

## Examples

```
minMAFeQTL.ANOVA(effsize = 1,
    typeI = 0.05,
    nTests = 200000,
    myntotal = 234,
    mypower = 0.8,
    verbose = TRUE)
```

minMAFeQTL.SLR

#### Description

Minimum detectable minor allele frequency (MAF) calculation for eQTL analysis that tests if a SNP is associated to a gene probe by using simple linear regression.

#### Usage

```
minMAFeQTL.SLR(slope,
    typeI = 0.05,
    nTests = 200000,
    myntotal = 200,
    mypower = 0.8,
    mystddev = 0.13,
    verbose = TRUE)
```

#### Arguments

slope	Slope of the simple linear regression.
typeI	Type I error rate for testing if a SNP is associated to a gene probe.
nTests	integer. Number of tests in eQTL analysis.
myntotal	integer. Number of subjects.
mypower	Desired power for the eQTL analysis.
mystddev	Standard deviation of the random error term $\epsilon$ in simple linear regression.
verbose	logic. indicating if intermediate results should be output.

#### Details

To test if a SNP is associated with a gene probe, we use the simple linear regression

$$y_i = \beta_0 + \beta_1 x_i + \epsilon_i,$$

where  $y_i$  is the gene expression level of the *i*-th subject,  $x_i$  is the genotype of the *i*-th subject, and  $\epsilon_i$  is the random error term. Additive coding for genotype is used. To test if the SNP is associated with the gene probe, we test the null hypothesis  $H_0: \beta_1 = 0$ .

Denote p as the minor allele frequency (MAF) of the SNP. Under Hardy-Weinberg equilibrium, we can calculate the variance of genotype of the SNP:  $\sigma_x^2 = 2p(1-p)$ , where  $\sigma_x^2$  is the variance of the predictor (i.e. the SNP)  $x_i$ .

We then can use Dupont and Plummer's (1998) power/sample size calculation formula to calculate the minimum detectable slope, adjusting for multiple testing.

## Value

The estimated minimum detectable MAF.

#### Author(s)

Xianjun Dong <XDONG@rics.bwh.harvard.edu>, Tzuu-Wang Chang <Chang.Tzuu-Wang@mgh.harvard.edu>, Scott T. Weiss <restw@channing.harvard.edu>, Weiliang Qiu <stwxq@channing.harvard.edu>

## References

Dupont, W.D. and Plummer, W.D.. Power and Sample Size Calculations for Studies Involving Linear Regression. Controlled Clinical Trials. 1998;19:589-601.

#### See Also

powerEQTL.SLR, ssEQTL.SLR

## Examples

```
minMAFeQTL.SLR(slope = 0.1299513,
    typeI = 0.05,
    nTests = 200000,
    myntotal = 176,
    mypower = 0.8,
    mystddev = 0.13,
    verbose = TRUE)
```

minSlopeEQTL.SLR	Minimum Detectable Slope Calculation for EQTL Analysis Based on
	Simple Linear Regression

## Description

Minimum detectable slope calculation for eQTL analysis that tests if a SNP is associated to a gene probe by using simple linear regression.

#### Usage

```
minSlopeEQTL.SLR(
   MAF,
   typeI = 0.05,
   nTests = 2e+05,
   myntotal = 200,
   mypower = 0.8,
   mystddev = 0.13,
   verbose = TRUE)
```

#### Arguments

MAF	Minor allele frequency.		
typeI	Type I error rate for testing if a SNP is associated to a gene probe.		
nTests	integer. Number of tests in eQTL analysis.		
myntotal	integer. Number of subjects.		
mypower	Desired power for the eQTL analysis.		
mystddev	Standard deviation of the random error term $\epsilon$ in simple linear regression		
verbose	logic. indicating if intermediate results should be output.		

## Details

To test if a SNP is associated with a gene probe, we use the simple linear regression

$$y_i = \beta_0 + \beta_1 x_i + \epsilon_i,$$

where  $y_i$  is the gene expression level of the *i*-th subject,  $x_i$  is the genotype of the *i*-th subject, and  $\epsilon_i$  is the random error term. Additive coding for genotype is used. To test if the SNP is associated with the gene probe, we test the null hypothesis  $H_0$ :  $\beta_1 = 0$ .

Denote p as the minor allele frequency (MAF) of the SNP. Under Hardy-Weinberg equilibrium, we can calculate the variance of genotype of the SNP:  $\sigma_x^2 = 2p(1-p)$ , where  $\sigma_x^2$  is the variance of the predictor (i.e. the SNP)  $x_i$ .

We then can use Dupont and Plummer's (1998) power/sample size calculation formula to calculate the minimum detectable slope, adjusting for multiple testing.

#### Value

The estimated minimum detectable slope.

#### Author(s)

Xianjun Dong <XDONG@rics.bwh.harvard.edu>, Tzuu-Wang Chang <Chang.Tzuu-Wang@mgh.harvard.edu>, Scott T. Weiss <restw@channing.harvard.edu>, Weiliang Qiu <stwxq@channing.harvard.edu>

#### References

Dupont, W.D. and Plummer, W.D.. Power and Sample Size Calculations for Studies Involving Linear Regression. Controlled Clinical Trials. 1998;19:589-601.

## See Also

powerEQTL.SLR, ssEQTL.SLR

## powerEQTL.ANOVA

## Examples

```
minSlopeEQTL.SLR(
    MAF = 0.1,
    typeI = 0.05,
    nTests = 2e+05,
    myntotal = 176,
    mypower = 0.8,
    mystddev = 0.13,
    verbose = TRUE)
```

powerEQTL.ANOVA	Power Calculation for EQTL Analysis Based on Un-Balanced One-
	Way ANOVA

## Description

Power calculation for eQTL analysis that tests if a SNP is associated to a gene probe by using un-balanced one-way ANOVA.

## Usage

## Arguments

MAF	Minor allele frequency.		
typeI	Type I error rate for testing if a SNP is associated to a gene probe.		
nTests	integer. Number of tests in eQTL analysis.		
myntotal	integer. Number of subjects.		
mystddev	Standard deviation of gene expression levels in one group of subjects. As- sume all 3 groups of subjects (mutation homozygote, heterozygote, wild-type homozygote) have the same standard deviation of gene expression levels.		
deltaVec	A vector having 2 elements. The first element is equal to $\mu_2 - \mu_1$ and the second elementis equal to $\mu_3 - \mu_2$ , where $\mu_1$ is the mean gene expression level for the mutation homozygotes, $\mu_2$ is the mean gene expression level for the heterozygotes, and $\mu_3$ is the mean gene expression level for the wild-type gene expression level.		
verbose	logic. indicating if intermediate results should be output.		

#### Details

The assumption of the ANOVA approach is that the association of a SNP to a gene probe is tested by using un-balanced one-way ANOVA (e.g. Lonsdale et al. 2013). According to SAS online document https://support.sas.com/documentation/cdl/en/statug/63033/HTML/default/viewer.htm#statug\_power\_a0000000982.htm, the power calculation formula is

$$power = Pr\left(F \ge F_{1-\alpha}\left(k-1, N-k\right) \middle| F \sim F_{k-1, N-k, \lambda}\right),$$

where k = 3 is the number of groups of subjects, N is the total number of subjects,  $F_{1-\alpha} (k - 1, N - k)$ is the  $100(1 - \alpha)$ -th percentile of central F distribution with degrees of freedoms k - 1 and N - k, and  $F_{k-1,N-k,\lambda}$  is the non-central F distribution with degrees of freedoms k - 1 and N - k and non-central parameter (ncp)  $\lambda$ . The ncp  $\lambda$  is equal to

$$\lambda = \frac{N}{\sigma^2} \sum_{i=1}^{k} w_i \left(\mu_i - \mu\right)^2,$$

where  $\mu_i$  is the mean gene expression level for the *i*-th group of subjects,  $w_i$  is the weight for the *i*-th group of subjects,  $\sigma^2$  is the variance of the random errors in ANOVA (assuming each group has equal variance), and  $\mu$  is the weighted mean gene expression level

$$\mu = \sum_{i=1}^{k} w_i \mu_i.$$

The weights  $w_i$  are the sample proportions for the 3 groups of subjects. Hence,  $\sum_{i=1}^{3} w_i = 1$ .

#### Value

power of the test after Bonferroni correction for multiple testing.

#### Author(s)

Xianjun Dong <XDONG@rics.bwh.harvard.edu>, Tzuu-Wang Chang <Chang.Tzuu-Wang@mgh.harvard.edu>, Scott T. Weiss <restw@channing.harvard.edu>, Weiliang Qiu <stwxq@channing.harvard.edu>

#### References

Lonsdale J and Thomas J, et al. The Genotype-Tissue Expression (GTEx) project. Nature Genetics, 45:580-585, 2013.

#### See Also

minEffectEQTL.ANOVA, powerEQTL.ANOVA2, ssEQTL.ANOVA, ssEQTL.ANOVA2

## Examples

```
myntotal = 234,
mystddev = 0.13,
deltaVec = c(0.13, 0.13))
```

powerEQTL.ANOVA2 Power Calculation for EQTL Analysis Based on Un-Balanced One-Way ANOVA

#### Description

Power calculation for eQTL analysis that tests if a SNP is associated to a gene probe by using un-balanced one-way ANOVA (assuming Hardy-Weinberg equilibrium).

#### Usage

#### Arguments

effsize	effect size $\delta/\sigma$ , where $\delta = \mu_2 - \mu_1 = \mu_3 - \mu_2$ , $\mu_1, \mu_2, \mu_3$ are the mean gene expression level of mutation homozygotes, heterozygotes, and wild-type homozygotes, and $\sigma$ is the standard deviation of gene expression levels (assuming each genotype group has the same variance).
MAF	Minor allele frequency.
typeI	Type I error rate for testing if a SNP is associated to a gene probe.
nTests	integer. Number of tests in eQTL analysis.
myntotal	integer. Number of subjects.
verbose	logic. indicating if intermediate results should be output.

## Details

The assumption of the ANOVA approach is that the association of a SNP to a gene probe is tested by using un-balanced one-way ANOVA (e.g. Lonsdale et al. 2013). According to SAS online document https://support.sas.com/documentation/cdl/en/statug/63033/HTML/default/viewer. htm#statug\_power\_a000000982.htm, the power calculation formula is

 $power = Pr(F \ge F_{1-\alpha}(k-1, N-k)|F \sim F_{k-1, N-k, \lambda}),$ 

where k = 3 is the number of groups of subjects, N is the total number of subjects,  $F_{1-\alpha}(k-1, N-k)$  is the  $100(1-\alpha)$ -th percentile of central F distribution with degrees of freedoms k-1 and N-k,

and  $F_{k-1,N-k,\lambda}$  is the non-central F distribution with degrees of freedoms k-1 and N-k and non-central parameter (ncp)  $\lambda$ . The ncp  $\lambda$  is equal to

$$\lambda = \frac{N}{\sigma^2} \sum_{i=1}^k w_i \left(\mu_i - \mu\right)^2,$$

where  $\mu_i$  is the mean gene expression level for the *i*-th group of subjects,  $w_i$  is the weight for the *i*-th group of subjects,  $\sigma^2$  is the variance of the random errors in ANOVA (assuming each group has equal variance), and  $\mu$  is the weighted mean gene expression level

$$\mu = \sum_{i=1}^k w_i \mu_i$$

The weights  $w_i$  are the sample proportions for the 3 groups of subjects. Hence,  $\sum_{i=1}^{3} w_i = 1$ . We assume that  $\mu_2 - \mu_1 = \mu_3 - \mu_2 = \delta$ , where  $\mu_1, \mu_2$ , and  $\mu_3$  are the mean gene expression level for mutation homozygotes, heterozygotes, and wild-type homozygotes, respectively.

Denote p as the minor allele frequency (MAF) of a SNP. Under Hardy-Weinberg equilibrium, we have genotype frequencies:  $p_2 = p^2$ ,  $p_1 = 2pq$ , and  $p_0 = q^2$ , where  $p_2$ ,  $p_1$ , and  $p_0$  are genotype for mutation homozygotes, heterozygotes, and wild-type homozygotes, respectively, q = 1 - p. Then ncp can be simplified as

$$ncp = 2pqN\left(rac{\delta}{\sigma}
ight)^2$$

#### Value

power of the test after Bonferroni correction for multiple testing.

#### Author(s)

Xianjun Dong <XDONG@rics.bwh.harvard.edu>, Tzuu-Wang Chang <Chang.Tzuu-Wang@mgh.harvard.edu>, Scott T. Weiss <restw@channing.harvard.edu>, Weiliang Qiu <stwxq@channing.harvard.edu>

#### References

Lonsdale J and Thomas J, et al. The Genotype-Tissue Expression (GTEx) project. Nature Genetics, 45:580-585, 2013.

#### See Also

minEffectEQTL.ANOVA, powerEQTL.ANOVA, ssEQTL.ANOVA, ssEQTL.ANOVA2

#### Examples

powerEQTL.SLR

## Description

Power calculation for eQTL analysis that tests if a SNP is associated to a gene probe by using simple linear regression.

## Usage

```
powerEQTL.SLR(
   MAF,
   typeI = 0.05,
   nTests = 2e+05,
   slope = 0.13,
   myntotal = 200,
   mystddev = 0.13,
   verbose = TRUE)
```

#### Arguments

MAF	Minor allele frequency.
typeI	Type I error rate for testing if a SNP is associated to a gene probe.
nTests	integer. Number of tests in eQTL analysis.
slope	Slope $\beta_1$ of the simple linear regression

$y_i =$	$\beta_0 +$	$-\beta_1 x_i$	+	$\epsilon_i$ ,
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	where $y_i$ is the gene expression level of the <i>i</i> -th subject, $x_i$ is the genotype of the <i>i</i> -th subject, and $\epsilon_i$ is the random error term. Additive coding for genotype is used.
myntotal	integer. Number of subjects.
mystddev	Standard deviation of the random error term $\epsilon$ in simple linear regression.
verbose	logic. indicating if intermediate results should be output.

#### Details

To test if a SNP is associated with a gene probe, we use the simple linear regression

$$y_i = \beta_0 + \beta_1 x_i + \epsilon_i,$$

where  $y_i$  is the gene expression level of the *i*-th subject,  $x_i$  is the genotype of the *i*-th subject, and  $\epsilon_i$  is the random error term. Additive coding for genotype is used. To test if the SNP is associated with the gene probe, we test the null hypothesis  $H_0$ :  $\beta_1 = 0$ .

Denote p as the minor allele frequency (MAF) of the SNP. Under Hardy-Weinberg equilibrium, we can calculate the variance of genotype of the SNP:  $\sigma_x^2 = 2p(1-p)$ , where  $\sigma_x^2$  is the variance of the predictor (i.e. the SNP)  $x_i$ .

We then can use Dupont and Plummer's (1998) power/sample size calculation formula to calculate the minimum detectable slope, adjusting for multiple testing.

#### Value

power of the test after Bonferroni correction for multiple testing.

#### Author(s)

Xianjun Dong <XDONG@rics.bwh.harvard.edu>, Tzuu-Wang Chang <Chang.Tzuu-Wang@mgh.harvard.edu>, Scott T. Weiss <restw@channing.harvard.edu>, Weiliang Qiu <stwxq@channing.harvard.edu>

#### References

Dupont, W.D. and Plummer, W.D.. Power and Sample Size Calculations for Studies Involving Linear Regression. Controlled Clinical Trials. 1998;19:589-601.

#### See Also

ssEQTL.SLR, minSlopeEQTL.SLR

## Examples

```
powerEQTL.SLR(
    MAF = 0.1,
    typeI = 0.05,
    nTests = 2e+05,
    slope = 0.13,
    myntotal = 176,
    mystddev = 0.13,
    verbose = TRUE)
```

ssEQTL.ANOVA

Sample Size Calculation for EQTL Analysis Based on Un-Balanced One-Way ANOVA

## Description

Sample size calculation for eQTL analysis that tests if a SNP is associated to a gene probe by using un-balanced one-way ANOVA.

## ssEQTL.ANOVA

#### Usage

```
ssEQTL.ANOVA(
    MAF,
    typeI = 0.05,
    nTests = 2e+05,
    mypower = 0.8,
    mystddev = 0.13,
    deltaVec = c(0.13, 0.13))
```

#### Arguments

MAF	Minor allele frequency.
typeI	Type I error rate for testing if a SNP is associated to a gene probe.
nTests	integer. Number of tests in eQTL analysis.
mypower	Desired power for the eQTL analysis.
mystddev	Standard deviation of gene expression levels in one group of subjects. As- sume all 3 groups of subjects (mutation homozygote, heterozygote, wild-type homozygote) have the same standard deviation of gene expression levels.
deltaVec	A vector having 2 elements. The first element is equal to $\mu_2 - \mu_1$ and the second elementis equalt to $\mu_3 - \mu_2$ , where $\mu_1$ is the mean gene expression level for the mutation homozygotes, $\mu_2$ is the mean gene expression level for the heterozygotes, and $\mu_3$ is the mean gene expression level for the wild-type gene expression level.

#### Details

The assumption of the ANOVA approach is that the association of a SNP to a gene probe is tested by using un-balanced one-way ANOVA (e.g. Lonsdale et al. 2013). According to SAS online document https://support.sas.com/documentation/cdl/en/statug/63033/HTML/default/viewer.htm#statug\_power\_a000000982.htm, the power calculation formula is

$$power = Pr(F \ge F_{1-\alpha}(k-1, N-k) | F \sim F_{k-1, N-k, \lambda})$$

where k = 3 is the number of groups of subjects, N is the total number of subjects,  $F_{1-\alpha} (k-1, N-k)$ is the  $100(1-\alpha)$ -th percentile of central F distribution with degrees of freedoms k-1 and N-k, and  $F_{k-1,N-k,\lambda}$  is the non-central F distribution with degrees of freedoms k-1 and N-k and non-central parameter (ncp)  $\lambda$ . The ncp  $\lambda$  is equal to

$$\lambda = \frac{N}{\sigma^2} \sum_{i=1}^{k} w_i \left(\mu_i - \mu\right)^2,$$

where  $\mu_i$  is the mean gene expression level for the *i*-th group of subjects,  $w_i$  is the weight for the *i*-th group of subjects,  $\sigma^2$  is the variance of the random errors in ANOVA (assuming each group has equal variance), and  $\mu$  is the weighted mean gene expression level

$$\mu = \sum_{i=1}^k w_i \mu_i.$$

The weights  $w_i$  are the sample proportions for the 3 groups of subjects. Hence,  $\sum_{i=1}^{3} w_i = 1$ .

## Value

sample size required for the eQTL analysis to achieve the desired power.

## Author(s)

Xianjun Dong <XDONG@rics.bwh.harvard.edu>, Tzuu-Wang Chang <Chang.Tzuu-Wang@mgh.harvard.edu>, Scott T. Weiss <restw@channing.harvard.edu>, Weiliang Qiu <stwxq@channing.harvard.edu>

#### References

Lonsdale J and Thomas J, et al. The Genotype-Tissue Expression (GTEx) project. Nature Genetics, 45:580-585, 2013.

#### See Also

minEffectEQTL.ANOVA, powerEQTL.ANOVA, powerEQTL.ANOVA2, ssEQTL.ANOVA2

## Examples

```
ssEQTL.ANOVA(MAF = 0.1,
    typeI = 0.05,
    nTests = 200000,
    mypower = 0.8,
    mystddev = 0.13,
    deltaVec = c(0.13, 0.13))
```

ssEQTL.ANOVA2	Sample Size Calculation for EQTL Analysis Based on Un-Balanced
	One-Way ANOVA

## Description

Sample size calculation for eQTL analysis that tests if a SNP is associated to a gene probe by using un-balanced one-way ANOVA.

#### Usage

```
ssEQTL.ANOVA2(
   effsize,
   MAF,
   typeI = 0.05,
   nTests = 2e+05,
   mypower = 0.8
)
```

#### ssEQTL.ANOVA2

#### Arguments

effsize	effect size $\delta/\sigma$ , where $\delta = \mu_2 - \mu_1 = \mu_3 - \mu_2$ , $\mu_1, \mu_2, \mu_3$ are the mean gene expression level of mutation homozygotes, heterozygotes, and wild-type homozygotes, and $\sigma$ is the standard deviation of gene expression levels (assuming each genotype group has the same variance).
MAF	Minor allele frequency.
typeI	Type I error rate for testing if a SNP is associated to a gene probe.
nTests	integer. Number of tests in eQTL analysis.
mypower	Desired power for the eQTL analysis.

#### **Details**

The assumption of the ANOVA approach is that the association of a SNP to a gene probe is tested by using un-balanced one-way ANOVA (e.g. Lonsdale et al. 2013). According to SAS online document https://support.sas.com/documentation/cdl/en/statug/63033/HTML/default/viewer. htm#statug\_power\_a0000000982.htm, the power calculation formula is

$$power = Pr(F \ge F_{1-\alpha}(k-1, N-k) | F \sim F_{k-1, N-k, \lambda}),$$

where k = 3 is the number of groups of subjects, N is the total number of subjects,  $F_{1-\alpha} (k-1, N-k)$ is the  $100(1-\alpha)$ -th percentile of central F distribution with degrees of freedoms k-1 and N-k, and  $F_{k-1,N-k,\lambda}$  is the non-central F distribution with degrees of freedoms k-1 and N-k and non-central parameter (ncp)  $\lambda$ . The ncp  $\lambda$  is equal to

$$\lambda = \frac{N}{\sigma^2} \sum_{i=1}^{k} w_i \left(\mu_i - \mu\right)^2,$$

where  $\mu_i$  is the mean gene expression level for the *i*-th group of subjects,  $w_i$  is the weight for the *i*-th group of subjects,  $\sigma^2$  is the variance of the random errors in ANOVA (assuming each group has equal variance), and  $\mu$  is the weighted mean gene expression level

$$\mu = \sum_{i=1}^{k} w_i \mu_i$$

The weights  $w_i$  are the sample proportions for the 3 groups of subjects. Hence,  $\sum_{i=1}^{3} w_i = 1$ .

We assume that  $\mu_2 - \mu_1 = \mu_3 - \mu_2 = \delta$ , where  $\mu_1, \mu_2$ , and  $\mu_3$  are the mean gene expression level for mutation homozygotes, heterozygotes, and wild-type homozygotes, respectively.

Denote p as the minor allele frequency (MAF) of a SNP. Under Hardy-Weinberg equilibrium, we have genotype frequencies:  $p_2 = p^2$ ,  $p_1 = 2pq$ , and  $p_0 = q^2$ , where  $p_2$ ,  $p_1$ , and  $p_0$  are genotype for mutation homozygotes, heterozygotes, and wild-type homozygotes, respectively, q = 1 - p. Then ncp can be simplified as

$$ncp = 2pqN\left(\frac{\delta}{\sigma}\right)^2,$$

#### Value

sample size required for the eQTL analysis to achieve the desired power.

#### Author(s)

Xianjun Dong <XDONG@rics.bwh.harvard.edu>, Tzuu-Wang Chang <Chang.Tzuu-Wang@mgh.harvard.edu>, Scott T. Weiss <restw@channing.harvard.edu>, Weiliang Qiu <stwxq@channing.harvard.edu>

#### References

Lonsdale J and Thomas J, et al. The Genotype-Tissue Expression (GTEx) project. Nature Genetics, 45:580-585, 2013.

## See Also

```
minEffectEQTL.ANOVA, powerEQTL.ANOVA, powerEQTL.ANOVA2, ssEQTL.ANOVA
```

#### Examples

```
ssEQTL.ANOVA2(
    effsize = 1,
    MAF = 0.1,
    typeI = 0.05,
    nTests = 2e+05,
    mypower = 0.8
)
```

ssEQTL.SLR	Sample Size Calculation for EQTL Analysis Based on Simple Linear
	Regression

## Description

Sample size calculation for eQTL analysis that tests if a SNP is associated to a gene probe by using simple linear regression.

## Usage

```
ssEQTL.SLR(
    MAF,
    typeI = 0.05,
    nTests = 2e+05,
    slope = 0.13,
    mypower = 0.8,
    mystddev = 0.13,
    n.lower = 2.01,
    n.upper = 1e+30,
    verbose = TRUE)
```

#### ssEQTL.SLR

#### Arguments

MAF	Minor allele frequency.	
typeI	Type I error rate for testing if a SNP is associated to a gene probe.	
nTests	integer. Number of tests in eQTL analysis.	
slope	Slope $\beta_1$ of the simple linear regression	
	$y_i = \beta_0 + \beta_1 x_i + \epsilon_i,$	
	where $y_i$ is the gene expression level of the <i>i</i> -th subject, $x_i$ is the genotype of the <i>i</i> -th subject, and $\epsilon_i$ is the random error term. Additive coding for genotype is used.	
mypower	Desired power for the eQTL analysis.	
mystddev	Standard deviation of the random error term $\epsilon$ .	
n.lower	integer. Lower bound of the total number of subjects.	
n.upper	integer. Upper bound of the total number of subjects.	
verbose	logic. indicating if intermediate results should be output.	

#### **Details**

To test if a SNP is associated with a gene probe, we use the simple linear regression

$$y_i = \beta_0 + \beta_1 x_i + \epsilon_i,$$

where  $y_i$  is the gene expression level of the *i*-th subject,  $x_i$  is the genotype of the *i*-th subject, and  $\epsilon_i$  is the random error term. Additive coding for genotype is used. To test if the SNP is associated with the gene probe, we test the null hypothesis  $H_0$ :  $\beta_1 = 0$ .

Denote p as the minor allele frequency (MAF) of the SNP. Under Hardy-Weinberg equilibrium, we can calculate the variance of genotype of the SNP:  $\sigma_x^2 = 2p(1-p)$ , where  $\sigma_x^2$  is the variance of the predictor (i.e. the SNP)  $x_i$ .

We then can use Dupont and Plummer's (1998) power/sample size calculation formula to calculate the minimum detectable slope, adjusting for multiple testing.

#### Value

sample size required for the eQTL analysis to achieve the desired power.

## Author(s)

Xianjun Dong <XDONG@rics.bwh.harvard.edu>, Tzuu-Wang Chang <Chang.Tzuu-Wang@mgh.harvard.edu>, Scott T. Weiss <restw@channing.harvard.edu>, Weiliang Qiu <stwxq@channing.harvard.edu>

#### References

Dupont, W.D. and Plummer, W.D.. Power and Sample Size Calculations for Studies Involving Linear Regression. Controlled Clinical Trials. 1998;19:589-601.

## See Also

powerEQTL.SLR, minSlopeEQTL.SLR

## Examples

ssEQTL.SLR( MAF = 0.1, typeI = 0.05, nTests = 2e+05, slope = 0.13, mypower = 0.8, mystddev = 0.13, n.lower = 2.01, n.upper = 1e+30, verbose = TRUE)

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