# Package 'SimplicialCubature'

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Title Numerical integration of functions over simplices

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<b>Depends</b> R (>= $3.0.0$ )
<b>Description</b> This package provides methods to integrate functions over m-dimensional simplices in n-dimensional Euclidean space. There are exact methods for polynomials and adaptive methods for integrating an arbitrary function.
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SimplicialCubature-package

Numerical integration of functions over simplices

## **Description**

This package provides methods to evaluate integrals of the form

$$\int_{S} f(x)dx,$$

where S is a simplex (or a union of simplices) in n-space and f(x) is a function defined on S. The function f(x) may be vector valued and the simplices can be m-dimensional simplices,  $1 \le m \le n$ . For example, if m=n-1, the package will evaluate a surface area integral; if m=1, the package will evaluate a line integral.

There are exact methods for polynomials and adaptive methods for integrating an arbitrary function. The two main functions are:

adaptIntegrateSimplex - integrate a general (possibly vector valued) function over a simplex using the method of Genz and Cools.

integrateSimplexPolynomial - integrate a single polynomial exactly over a simplex using either the Grundmann-Moller method or the Lasserre-Avrachenkov method.

The naming of the functions, arguments, and return values deliberately mimics that in the CRAN packages cubature (for integrating over hyper-rectangles) and SphericalCubature (for integrating over spheres and balls).

Please let me know if you find any mistakes. I will try to fix bugs promptly.

Constructive comments for improvements are welcome; actually implementing any suggestions will be dependent on time constraints.

Version history:

• 1.0.1 (2014-09-09) original package

## Details

Package: SimplicialCubature

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#### Author(s)

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#### References

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A. Grundmann and H.M. Moller, Invariant Integration Formulas for the \$n\$-Simplex by Combinatorial Methods, SIAM Journal on Numerical Analysis, 15, 282-289 (1978)

J. B. Lasserre and E. E. Avrachenkov, The Multi-Dimensional Version of  $\int_a^b x^p dx$ , American Mathematical Monthly, 108, 151-154 (2001)

N. Konerth, Exact integration on simplices, Undergraduate Research Paper, Math/Stat Department, American University (2014)

#### See Also

adaptIntegrateSimplex, integrateSimplexPolynomial

adaptIntegrateSimplex Integrate a general function over a simplex

#### **Description**

Adaptive integration of a function f(x) of n variables over an m-dimensional simplex S,  $1 \le m \le n$ . More generally, f can be a vector valued function and S can be a list of simplices.

## Usage

```
adaptIntegrateSimplex(f, S, fDim = 1L, maxEvals = 10000L, absError = 0, tol = 1e-05,
    integRule = 3L, partitionInfo = FALSE, ...)
```

#### Arguments

f a function of n-variables (where n is determined by S) or a vector valued function (if fDim > 1).

a simplex or list of simplices that specify the region of integration. A single simplex S is given by an n x (m+1) matrix, where n is the dimension of the underlying space and m is the dimension of the simplex,  $1 \le m \le n$ . In this case, the columns S[,1],...,S[,m+1] are the vertices of the m-dimensional simplex. If S is an n x (m+1) x k array, then the region of integration is the union of the simplices S[,1],...,S[,k], each of the above form.

fDim integer dimension of the integrand function.

maxEvals integer maximum number of function evaluations allowed absError requested absolute error in the computation of the integral requested relative error in the computation of the integral

integRule integer in the range 1:4 specifying degree of integration rule: a (2\*integRule+1)

degree integration rule is used in function adsimp.

partitionInfo if FALSE, then only the results of the computations are returned. If TRUE,

then partition information is also returned. This will require more memory, but

sometimes that information can be useful for other purposes.

 $\dots$  optional arguments to integrand function  $f(x,\dots)$ 

#### **Details**

If m=n, then an R translation of Alan Genz's function adsimp(...) is used to evaluate the n-dimensional integral. It works by adaptively splitting the region of integration into finer partitions, always splitting the simplex with the largest estimated error.

If 1 < m < n, then the integral is evaluated by mapping the m-simplex in R^n to the canonical simplex in m-dimensional space, using function adsimp on that 'full' m-dimensional integral, and correcting with the Jacobian of the transformation.

If m=1, the built-in R function integrate (based on QUADPACK 1-dimensional adaptive quadrature) is used to evaluate the line integral.

#### Value

A list containing:

integral estimated value of the integral, it is a vector if fDim > 1

estAbsError estimated absolute error

functionEvaluations

count of number of function evaluations

returnCode integer status: returnCode=0 is a successful return; non-zero error values are

described by next variable

message text message explaining returnCode; "OK" for normal return

subsimplices if partitionInfo=TRUE, this gives an array of subsimplices, see function adsimp

for more details.

subsimplicesIntegral

if partitionInfo=TRUE, this array gives estimated values of each component of the integral on each subsimplex, see function adsimp for more details.

subsimplicesAbsError

if partitionInfo=TRUE, this array gives estimated values of the absolute error of each component of the integral on each subsimplex, see function adsimp for more details.

subsimplicesVolume

if partitionInfo=TRUE, vector of volumes of subsimplices

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#### Note

No check is done on the simplices to see that they are disjoint.

When m > 1 and fDim > 1, adsimp uses the same grid for each coordinate of f.

When m=1, adsimp does not handle the line integral case, and the built-in R function integrate is used to evaluate the integral. In this 1-dimensional case, no partition information is available (integrate does not provide that information) and if fDim > 1, the components of the integral are evaluated independently, with an upper limit of maxEvals function evaluations for each component. This means that (a) a different grid may be used for each component, and (b) the return variable functionEvaluations is the sum of the number of function evaluations for each component; it may be up to maxEvals\*fDim.

#### References

See references to Genz and Cool (2003) in SimplicialCubature-package.

#### **Examples**

```
n <- 4
S <- CanonicalSimplex( n )</pre>
f1 \leftarrow function(x) \{x[1]^3\}
adaptIntegrateSimplex( f1, S ) # correct answer 0.00119047619
str(adaptIntegrateSimplex(f1, S, partitionInfo=TRUE)) # same result, with more info returned
# test with vector valued integrand
f2 \leftarrow function(x) \{ c(x[1]^3,x[3]^4) \}
adaptIntegrateSimplex(f2, S, fDim=2) # correct answer 0.00119047619 0.0005952380952
# test with vector valued integrand and extra arguments
f3 <- function( x, extra.arg ) { extra.arg*c(x[1]^3,x[3]^4) } # multiple of f2 above
adaptIntegrateSimplex(f3, S, fDim=2, extra.arg=100) # correct answer 0.119047619 0.05952380952
# integrate over lower dimensional simplices
adaptIntegrateSimplex( f1, UnitSimplex(4) ) # answer = 0.01666667
f4 <- function(x) { 1 }
# 2-dim integral, exact answer area of unit simplex = sqrt(3)/2 = 0.8660254...
adaptIntegrateSimplex( f4, UnitSimplex(3) )
# line integral over diamond, exact answer=arclength=4*sqrt(2)=5.656854...
S4 \leftarrow array(c(1,0,0,1,0,1,-1,0,-1,0,0,-1,0,-1,1,0),dim=c(2,2,4))
adaptIntegrateSimplex( f4, S4 )
```

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#### **Description**

adsimp is a translation of Alan Genz's matlab program adsimp.m to adaptively integrate over a simplex. The other functions listed below are all called by adsimp. These functions are used internally; use at your own risk.

#### Usage

```
adsimp(ND, VRTS, NF, F, MXFS, EA, ER, KEY, partitionInfo = FALSE)
SMPCHC(ND, NF, MXFS, EA, ER, SBS, KEY)
SMPDFS(ND, NF, F, TOP, SBS, VRTS)
SMPRMS(N, KEY)
SMPRUL(ND, VRTS, VOL, NF, F, G, W, PTS)
SMPSAD(ND, NF, F, MXFS, EA, ER, KEY, RCLS, SBS, VRTS, partitionInfo)
SMPSMS(N, VERTEX, NF, F, G)
```

#### **Arguments**

ND, N dimension of the space

VRTS, VERTEX array specifying the simplices

NF dimension of the function; F(x) has NF coordinates

F a function of ND variables, value F(x) has NF coordinates

MXFS maximum number of function evaluations allowed

EA requested absolute error
ER requested relative error

KEY integration rule

 $partition Info \quad TRUE \ or \ FALSE, see \ adaptIntegrateSimplex$ 

SBS number of subsimplices
TOP pointer to a subsimplex
VOL volume of a simplex

G generators for integration rule
W weights for an integration rule
PTS points in an integration rule

RCLS number of terms in an integration rule

## Value

Not meant to be used directly, they called from function adaptIntegrateSimplex(...).

#### See Also

```
adaptIntegrateSimplex
```

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CanonicalSimplex

Internal functions for defining/working with simplices.

## **Description**

These are utility functions that are useful when defining/working with simplices in n-dimensional space.

## Usage

```
CanonicalSimplex(n)
UnitSimplex(n)
SimplexVolume(S)
JacobianS2Canonical(S2)
```

#### **Arguments**

n	positive integer giving the dimension of the space
S	an n x $(n+1)$ matrix specifying a single n-dimensional simplex; the columns $S[,1],,S[,n+1]$ give the vertices of the simplex.
S2	an n x (m+1) matrix specifying a single m-dimensional simplex, with $m \le n$ ; the columns S[,1],,S[,m+1] give the vertices of the simplex.

#### Value

Let e[j] be the j-th standard unit basis vector. CanonicalSimplex(n) gives the simplex with columns being vertices of the canonical simplex in n-dimensions: the n-dim. simplex with vertices (0,0,...,0) and e[1],...,e[n]. A vector (u[1],...,u[n]) is in the canonical simplex if 0 <= u[i] <= 1 for all i and sum(u) <= 1. UnitSimplex(n) gives the vertices of the unit simplex, namely e[1],...,e[n]. A vector (u[1],...,u[n]) is in the unit simplex if 0 <= u[i] <= 1 for all i and sum(u) == 1. SimplexVolume(S) returns the n-dim. volume of S; JacobianS2Canonical(S2) returns the Jacobian of the transformation from an m-dim. simplex S2 to the m-dim. canonical simplex.

## **Examples**

```
CanonicalSimplex(3)
UnitSimplex(3)
SimplexVolume( CanonicalSimplex(3) )
JacobianS2Canonical( UnitSimplex(3) )
```

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Define, evaluate, or print a polynomial

## **Description**

Utility functions to work with a multivariate polynomial.

#### Usage

```
definePoly(coef, k)
printPoly( p, num.digits )
evalPoly( x, p, useTerm=rep(TRUE, length(p$coef) ) )
```

#### **Arguments**

a vector of coefficients, one for each term of p(x)

k a matrix of (non-negative, integer) powers

p a polynomial, defined by definePoly

num.digits number of digits to print for the coefficients of the polynomial

x a (n x m) matrix, with columns containing the vectors where the polynomial should be evaluated

useTerm vector of boolean values: if useTerm[i]=TRUE, term i is included in the evalua-

## tion; if useTerm[i]=FALSE, term i is not included.

#### **Details**

These are utility functions for use with integrateSimplexPolynomial. definePoly is used to define a polynomial:

$$p(x) = \sum_{i=1}^{\text{length(coef)}} \text{coef}_i x_1^{k[i,1]} x_2^{k[i,2]} \cdots x_n^{k[i,n]}$$

printPoly prints a polynomial in human readable form.

evalPoly evaluates a polynomial at each of the vectors x[,1],x[,2],...,x[,m]. The optional argument useTerm is for internal use.

See example below.

#### Value

For definePoly, a list is returned. That list can be used by integrateSimplexPolynomial, printPoly, or evalPoly.

For printPoly, nothing is returned, but a human readable format is printed on the console.

For evalPoly, a vector of m values: y[i] = p(x[,i]).

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#### Note

The internal definition of a polynomial may change in the future.

#### See Also

integrateSimplexPolynomial

#### **Examples**

```
p1 <- definePoly( c(3,5), matrix(c(3,0,0,0, 0,2,1,4), nrow=2, ncol=4, byrow=TRUE ) ) printPoly(p1) evalPoly( c(1,3,1,2) , p1 ) # f(1,3,1,2) = 723
```

grnmol

Grundmann-Moller integration of a function over a simplex

## **Description**

Computes an approximation to the integral of a function f(x) over a simplex S. This is an R translation of the matlab function grnmol.m which was written by Alan Genz.

## Usage

```
grnmol(f, V, s)
```

#### **Arguments**

f a (real-valued) function f that can be evaluated at all points in V.

V a single simplex, specified by an  $(n \times (n+1))$  matrix. The columns V[,1],...,V[,n+1]

are the vertices of the simplex.

s a positive integer specifying the order of the rule used

#### **Details**

The Grundmann-Moller algorithm approximates the integral of f(x) over the simplex V. When f(x) is a polynomial, and s is large enough, the integral is exact. This function is called by integrateSimplexPolynomial.

## Value

Q a vector of length s+1, with Q[i] the i-th degree approximate value of the integral number of function evaluations used

#### References

See reference by Grundmann and Moller in SimplicialCubature-package.

#### **Examples**

```
f <- function( x ) { x[1]^2*x[4]^5 } grnmol( f, CanonicalSimplex(4), s=4 )
```

integrateSimplexPolynomial

Exact integration of a polynomial over a simplex

#### **Description**

Computes the exact integral of a polynomial p(x) over an m-dimensional simplex S in n-dimensional space,  $1 \le m \le n$ . The methods are exact for polynomials, no approximation is used. The only inaccuracies possible are in the floating point evaluation of knots, coefficients, evaluation of the polynomial, sums, and products.

#### **Usage**

```
integrateSimplexPolynomial(p, S, method="GM")
```

#### **Arguments**

p a single polynomial, defined though function polyDefine.

S Either a single simplex, specified by an n x (m+1) matrix with the columns

S[,1],...,S[,n+1] giving the vertices of the simplex, or a n x (m+1) x k array with

S[,,1],...,S[,,k] each a single simplex as described above.

method either "GM" (for the Grundmann-Moller method) or "LA" (for the Lasserre-

Avrenchenkov) method

#### **Details**

If method="GM", the Grundmann-Moller method is used; it is exact for polynomials (because the function chooses a rule of high enough degree for the degree of the polynomial p(x)). This is faster, requiring fewer function evaluations. This method works for  $n \ge 1$  and  $1 \le m \le n$ .

If method="LA", the algorithm splits the polynomial into terms that are homogeneous of degree q, uses the method of Lasserre and Avrachenkov to exactly integrate those terms, and sums over all degrees. This method is slower, requiring more function evaluations. The degree of the polynomial has more effect on execution time than the number of terms or number of variables. This method only works with n>1 and m=n.

#### Value

integral value of the integral functionEvaluations

number of function evaluations used

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#### References

See references in SimplicialCubature-package.

#### **Examples**

```
S <- CanonicalSimplex( 4 ) # 4-dim. simplex
p1 \leftarrow definePoly(1.0, matrix(c(2,0,0,5), nrow=1))
printPoly(p1)
# same as example for function grnmol(), but explicitly using the fact that the integrand
# function is a polynomial, and automatic selection of the order of the integration rule
integrateSimplexPolynomial( p1, S, method="GM" )
integrateSimplexPolynomial( p1, S, method="LA" )
p2 \leftarrow definePoly(c(5,-6), matrix(c(3,1,0,0,0,0,0,7), nrow=2, byrow=TRUE))
printPoly( p2 )
integrateSimplexPolynomial( p2, S, method="GM" ) # correct answer -1.352814e-05
integrateSimplexPolynomial( p2, S, method="LA" ) # correct answer -1.352814e-05
# integrate random polynomials and random simplices in different dimensions
for (n in 3:5) {
 S <- matrix( rnorm(n*(n+1)), nrow=n, ncol=n+1 )</pre>
 p.rand <- definePoly( rnorm(1), matrix( c(4, rep(0, n-1)), nrow=1) )
 #printPoly(p.rand)
 tmp1 <- integrateSimplexPolynomial( p.rand, S, method="GM" )</pre>
 tmp2 <- integrateSimplexPolynomial( p.rand, S, method="LA" )</pre>
 " LA integral=", tmp2$integral, " functionEvaluations=",tmp2$functionEvaluations,"\n")
```

LasserreAvrachenkov Internal functions for integrateSimplexPolynomial.

## Description

LasserreAvrachenkov implements the exact integration formula for a homogeneous polynomial p of degree q. The other functions are helper functions for that.

#### Usage

```
LasserreAvrachenkov(q, p, useTerm, S)
nextIndexLA(current.n, b)
nextIntBaseB(current.n, b)
```

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## Arguments

q	degree of the polynomial p
p	polynomial obtained by calling definePoly
useTerm	vector of booleans, telling which terms are homogeneous of degree q
S	an n x $(n+1)$ matrix specifying a single simplex; the columns S[,1],,S[,n+1] give the vertices of the simplex.
current.n	vector of integers giving the base b representation of a (non-negative) integer
b	base used for the base b representation of an integer

## Value

Not meant to be called externally.

## References

See Lasserre and Avrachenkov, Baldoni, et al., and Konerth references in SimplicialCubature-package.

## See Also

 $integrate {\tt SimplexPolynomial}$ 

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