

## NAG C Library Function Document

### nag\_rngs\_arma\_time\_series (g05pac)

#### 1 Purpose

nag\_rngs\_arma\_time\_series (g05pac) generates a realisation of a univariate time series from an autoregressive moving average (ARMA) model. The realisation may be continued or a new realisation generated at subsequent calls to nag\_rngs\_arma\_time\_series (g05pac).

#### 2 Specification

```
#include <nag.h>
#include <nagg05.h>

void nag_rngs_arma_time_series (Integer mode, double xmean, Integer p,
    const double phi[], Integer q, const double theta[], double avar, double *var,
    Integer n, double x[], Integer igen, Integer iseed[], double r[],
    NagError *fail)
```

#### 3 Description

Let the vector  $x_t$ , denote a time series which is assumed to follow an autoregressive moving average (ARMA) model of the form:

$$x_t - \mu = \phi_1(x_{t-1} - \mu) + \phi_2(x_{t-2} - \mu) + \dots + \phi_p(x_{t-p} - \mu) + \epsilon_t - \theta_1\epsilon_{t-1} - \theta_2\epsilon_{t-2} - \dots - \theta_q\epsilon_{t-q} \quad (1)$$

where  $\epsilon_t$ , is a residual series of independent random perturbations assumed to be Normally distributed with zero mean and variance  $\sigma^2$ . The arguments  $\{\phi_i\}$ , for  $i = 1, 2, \dots, p$ , are called the autoregressive (AR) arguments, and  $\{\theta_j\}$ , for  $j = 1, 2, \dots, q$ , the moving average (MA) arguments. The arguments in the model are thus the  $p$   $\phi$  values, the  $q$   $\theta$  values, the mean  $\mu$  and the residual variance  $\sigma^2$ .

nag\_rngs\_arma\_time\_series (g05pac) sets up a reference vector containing initial values corresponding to a stationary position using the method described in Tunnicliffe–Wilson (1979). The function can then return a realisation of  $x_1, x_2, \dots, x_n$ . On a successful exit, the recent history is updated and saved in the reference vector **r** so that nag\_rngs\_arma\_time\_series (g05pac) may be called again to generate a realisation of  $x_{n+1}, x_{n+2}, \dots$ , etc. See the description of the argument **mode** in Section 5 for details.

One of the initialization functions nag\_rngs\_init\_repeatable (g05kbc) (for a repeatable sequence if computed sequentially) or nag\_rngs\_init\_nonrepeatable (g05kcc) (for a non-repeatable sequence) must be called prior to the first call to nag\_rngs\_arma\_time\_series (g05pac).

#### 4 References

Knuth D E (1981) *The Art of Computer Programming (Volume 2)* (2nd Edition) Addison–Wesley

Tunnicliffe–Wilson G (1979) Some efficient computational procedures for high order ARMA models *J. Statist. Comput. Simulation* **8** 301–309

#### 5 Arguments

1: **mode** – Integer *Input*

*On entry:* a code for selecting the operation to be performed by the function:

**mode** = 0

Set up reference vector only.

- mode** = 1  
Generate terms in the time series using reference vector set up in a prior call to `nag_rngs_arma_time_series` (g05pac).
- mode** = 2  
Set up reference vector and generate terms in the time series.  
*Constraint:*  $0 \leq \mathbf{mode} \leq 2$ .
- 2: **xmean** – double *Input*  
*On entry:* the mean of the time series.
- 3: **p** – Integer *Input*  
*On entry:*  $p$ , the number of autoregressive coefficients supplied.  
*Constraint:*  $\mathbf{p} \geq 0$ .
- 4: **phi**[*dim*] – const double *Input*  
**Note:** the dimension, *dim*, of the array **phi** must be at least  $\max(1, \mathbf{p})$ .  
*On entry:* the autoregressive coefficients of the model,  $\phi_1, \phi_2, \dots, \phi_p$ .
- 5: **q** – Integer *Input*  
*On entry:*  $q$ , the number of moving average coefficients supplied.  
*Constraint:*  $\mathbf{q} \geq 0$ .
- 6: **theta**[*dim*] – const double *Input*  
**Note:** the dimension, *dim*, of the array **theta** must be at least  $\max(1, \mathbf{q})$ .  
*On entry:* the moving average coefficients of the model,  $\theta_1, \theta_2, \dots, \theta_q$ .
- 7: **avar** – double *Input*  
*On entry:* the variance of the normal perturbations,  $\sigma^2$ .  
*Constraint:* **avar**  $\geq 0.0$ .
- 8: **var** – double \* *Output*  
*On exit:* the proportion of the variance of a term in the series that is due to the moving-average (error) terms in the model. The smaller this is, the nearer is the model to non-stationarity.
- 9: **n** – Integer *Input*  
*On entry:*  $n$ , the number of observations to be generated.  
*Constraint:*  $\mathbf{n} \geq 0$ .
- 10: **x**[*dim*] – double *Output*  
**Note:** the dimension, *dim*, of the array **x** must be at least  $\max(1, \mathbf{n})$ .  
*On exit:* contains the next  $n$  observations from the time series.
- 11: **igen** – Integer *Input*  
*On entry:* must contain the identification number for the generator to be used to return a pseudo-random number and should remain unchanged following initialization by a prior call to one of the functions `nag_rngs_init_repeatable` (g05kbc) or `nag_rngs_init_nonrepeatable` (g05kcc).

- 12: **iseed**[4] – Integer *Input/Output*  
*On entry:* contains values which define the current state of the selected generator.  
*On exit:* contains updated values defining the new state of the selected generator.
- 13: **r**[*dim*] – double *Output*  
**Note:** the dimension, *dim*, of the array **r** must be at least  $\mathbf{p} + \mathbf{q} + 5 + \max(\mathbf{p}, \mathbf{q} + 1)$ .  
*On exit:* the reference vector.
- 14: **fail** – NagError \* *Input/Output*  
The NAG error argument (see Section 2.6 of the Essential Introduction).

## 6 Error Indicators and Warnings

### NE\_BAD\_PARAM

On entry, argument  $\langle value \rangle$  had an illegal value.

### NE\_INT

On entry, **mode** =  $\langle value \rangle$ .  
Constraint:  $0 \leq \mathbf{mode} \leq 2$ .

On entry, **n** =  $\langle value \rangle$ .  
Constraint:  $\mathbf{n} \geq 0$ .

On entry, **p** =  $\langle value \rangle$ .  
Constraint:  $\mathbf{p} \geq 0$ .

On entry, **q** =  $\langle value \rangle$ .  
Constraint:  $\mathbf{q} \geq 0$ .

### NE\_INTERNAL\_ERROR

An internal error has occurred in this function. Check the function call and any array sizes. If the call is correct then please consult NAG for assistance.

### NE\_REAL

On entry, **avar** =  $\langle value \rangle$ .  
Constraint:  $\mathbf{avar} \geq 0.0$ .

### NE\_STATIONARY\_AR

**phi** does not define a stationary autoregressive process.

## 7 Accuracy

The errors in the initialization process should be very much smaller than the error term; see Tunnicliffe–Wilson (1979).

## 8 Further Comments

The time taken by `nag_rngs_arma_time_series` (g05pac) is essentially of order  $(\mathbf{p})^2$ .

**Note:** `nag_rngs_init_repeatable` (g05kbc) and `nag_rngs_init_nonrepeatable` (g05kcc) must be used with care if this function is used as well. The reference vector, as mentioned before, contains a copy of the recent history of the series. This will not be altered properly by calls to any of the above functions. A call to `nag_rngs_init_repeatable` (g05kbc) or `nag_rngs_init_nonrepeatable` (g05kcc) should be followed by a call to `nag_rngs_arma_time_series` (g05pac) with **mode** = 0 to re-initialize the time series reference vector

in use. To maintain repeatability with `nag_rngs_init_repeatable` (g05kbc), the calls to `nag_rngs_arma_time_series` (g05pac) should be performed in the same order and at the same point or points in the simulation every time `nag_rngs_init_repeatable` (g05kbc) is used. When the generator state is saved and restored using the arguments **igen** and **iseed**, the time series reference vector must be saved and restored as well.

The ARMA model for a time series can also be written as:

$$(x_n - E) = A_1(x_{n-1} - E) + \dots + A_{NA}(x_{n-NA} - E) + B_1a_n + \dots + B_{NB}a_{n-NB+1}$$

where

$x_n$  is the observed value of the time series at time  $n$ ,

$NA$  is the number of autoregressive arguments,  $A_i$ ,

$NB$  is the number of moving average arguments,  $B_i$ ,

$E$  is the mean of the time series,

and

$a_t$  is a series of independent random Standard Normal perturbations.

This is related to the form given in Section 3 by:

$$B_1^2 = \sigma^2,$$

$$B_{i+1} = -\theta_i\sigma = -\theta_iB_1, \quad i = 1, 2, \dots, q,$$

$$NB = q + 1,$$

$$E = c,$$

$$A_i = \phi_i, \quad i = 1, 2, \dots, p,$$

$$NA = p.$$

## 9 Example

This example program calls `nag_rngs_arma_time_series` (g05pac) to set up the reference vector for an autoregressive model after initialization by `nag_rngs_init_repeatable` (g05kbc). The model is given by

$$x_t = 0.4x_{t-1} + 0.2x_{t-2} + \epsilon_t$$

where  $\epsilon_t$  is a series of independent random Normal perturbations with variance 1.0. `nag_rngs_arma_time_series` (g05pac) is then called to generate a sample of ten observations, which are printed.

### 9.1 Program Text

```

/* nag_rngs_arma_time_series (g05pac) Example Program.
 *
 * Copyright 2001 Numerical Algorithms Group.
 *
 * Mark 7, 2001.
 */

#include <stdio.h>
#include <nag.h>
#include <nag_stdlib.h>
#include <nagg05.h>

int main(void)
{
    /* Scalars */
    double avar, var, xmean;
    Integer i, igen, ip, iq, n, nr;
    Integer exit_status=0;
    NagError fail;

```

```

/* Arrays */
double *phi=0, *r=0, *theta=0, *x=0;
Integer iseed[4];

INIT_FAIL(fail);
Vprintf("nag_rngs_arma_time_series (g05pac) Example Program Results\n\n");

ip=2;
iq=0;
n=10;
nr=ip+iq+5+ip;

/* allocate memory */
if ( !(phi = NAG_ALLOC(ip, double)) ||
    !(r = NAG_ALLOC(nr, double)) ||
    !(theta = NAG_ALLOC(1, double)) ||
    !(x = NAG_ALLOC(n, double)) )
{
    Vprintf("Allocation failure\n");
    exit_status = -1;
    goto END;
}

/* Set the ARMA model parameters */
xmean = 0.0;
phi[0] = 0.4;
phi[1] = 0.2;
avar = 1.0;

/* Initialise the seed to a repeatable sequence */
iseed[0] = 1762543;
iseed[1] = 9324783;
iseed[2] = 4234401;
iseed[3] = 742355;
/* igen identifies the stream. */
igen = 1;
/* nag_rngs_init_repeatable (g05kbc).
 * Initialize seeds of a given generator for random number
 * generating functions (that pass seeds explicitly) to give
 * a repeatable sequence
 */
nag_rngs_init_repeatable(&igen, iseed);

/* Set up the reference vector */
/* nag_rngs_arma_time_series (g05pac).
 * Generates a realisation of a time series from an ARMA
 * model
 */
nag_rngs_arma_time_series(0, xmean, ip, phi, iq, theta, avar, &var, n, x,
                          igen, iseed, r, &fail);
if (fail.code != NE_NOERROR)
{
    Vprintf("Error from nag_rngs_arma_time_series (g05pac).\n%s\n",
           fail.message);
    exit_status = 1;
    goto END;
}
/* Generate a sample of 10 observations */
/* nag_rngs_arma_time_series (g05pac), see above. */
nag_rngs_arma_time_series(1, xmean, ip, phi, iq, theta, avar, &var, n, x,
                          igen, iseed, r, &fail);
if (fail.code != NE_NOERROR)
{
    Vprintf("Error from nag_rngs_arma_time_series (g05pac).\n%s\n",
           fail.message);
    exit_status = 1;
    goto END;
}
for (i = 0; i < n; ++i)
{
    Vprintf("%12.4f\n", x[i]);
}

```

```
    }  
END:  
  if (phi) NAG_FREE(phi);  
  if (r) NAG_FREE(r);  
  if (theta) NAG_FREE(theta);  
  if (x) NAG_FREE(x);  
  return exit_status;  
}
```

## 9.2 Program Data

None.

## 9.3 Program Results

nag\_rngs\_arma\_time\_series (g05pac) Example Program Results

```
-1.0654  
-0.2828  
-2.0924  
-2.3304  
-2.5998  
-1.7143  
-2.4882  
-1.3882  
-2.2722  
-1.8806
```

---