# NAG Library Function Document

# nag_tsa_spectrum_univar (g13cbc)

## 1 Purpose

nag_tsa_spectrum_univar (g13cbc) calculates the smoothed sample spectrum of a univariate time series using spectral smoothing by the trapezium frequency (Daniell) window.

## 2 Specification

```
#include <nag.h>
#include <nagg13.h>
void nag_tsa_spectrum_univar (Integer nx, NagMeanOrTrend mt_correction,
     double px, Integer mw, double pw, Integer l, Integer kc,
     Nag_LoggedSpectra lg_spect, const double x[], double **g, Integer *ng,
     double stats[], NagError *fail)
```

## 3 Description

The supplied time series may be mean or trend corrected (by least squares), and tapered, the tapering factors being those of the split cosine bell:

$$\begin{array}{cc} \frac{1}{2}\left(1-\cos\left(\frac{\pi\left(t-\frac{1}{2}\right)}{T}\right)\right), & 1 \le t \le T \\ \frac{1}{2}\left(1-\cos\left(\frac{\pi\left(n-t+\frac{1}{2}\right)}{T}\right)\right), & n+1-T \le t \le n \\ 1, & \text{otherwise} \end{array}$$

where $T = \left[\frac{np}{2}\right]$ and $p$ is the tapering proportion.

The unsmoothed sample spectrum

$$f^*(\omega) = \frac{1}{2}\pi\left|\sum_{t=1}^{n} x_t \exp(i\omega t)\right|^2$$

is then calculated for frequency values

$$\omega_k = \frac{2\pi k}{K}, k = 0, 1, \ldots, [K/2]$$

where [ ] denotes the integer part.

The smoothed spectrum is returned as a subset of these frequencies for which $K$ is a multiple of a chosen value $r$, i.e.,

$$\omega_{rl} = \nu_l = \frac{2\pi l}{L}, l = 0, 1, \ldots, [L/2]$$

where $K = r \times L$. You will normally fix $L$ first, then choose $r$ so that $K$ is sufficiently large to provide an adequate representation for the unsmoothed spectrum, i.e., $K \ge 2 \times n$. It is possible to take $L = K$, i.e., $r = 1$.

The smoothing is defined by a trapezium window whose shape is supplied by the function

$$\begin{array}{cc} W(\alpha) = 1, & |\alpha| \le p \\ W(\alpha) = \frac{1-|\alpha|}{1-p}, & p < |\alpha| \le 1 \end{array}$$

the proportion $p$ being supplied by you.

The width of the window is fixed as $2\pi/M$ by supplying $M$. A set of averaging weights are constructed:

$$W_k = g \times W\left(\frac{\omega_k M}{\pi}\right), 0 \leq \omega_k \leq \frac{\pi}{M}$$

where $g$ is a normalizing constant, and the smoothed spectrum obtained is

$$\hat{f}(\nu_l) = \sum_{|\omega_k| < \frac{\pi}{M}} W_k f^*(\nu_l + \omega_k).$$

If no smoothing is required $M$ should be set to $n$, in which case the values returned are $\hat{f}(\nu_l) = f^*(\nu_l)$. Otherwise, in order that the smoothing approximates well to an integration, it is essential that $K \gg M$, and preferable, but not essential, that $K$ be a multiple of $M$. A choice of $L > M$ would normally be required to supply an adequate description of the smoothed spectrum. Typical choices of $L \simeq n$ and $K \simeq 4n$ should be adequate for usual smoothing situations when $M < n/5$.

The sampling distribution of $\hat{f}(\omega)$ is approximately that of a scaled $\chi^2_d$ variate, whose degrees of freedom $d$ is provided by the function, together with multiplying limits $mu$, $ml$ from which approximate 95% confidence intervals for the true spectrum $f(\omega)$ may be constructed as $\left[ml \times \hat{f}, (\omega), mu, \times, \hat{f}, (\omega)\right]$. Alternatively, log $\hat{f}(\omega)$ may be returned, with additive limits.

The bandwidth $b$ of the corresponding smoothing window in the frequency domain is also provided. Spectrum estimates separated by (angular) frequencies much greater than $b$ may be assumed to be independent.

## 4 References

Bloomfield P (1976) *Fourier Analysis of Time Series: An Introduction* Wiley

Jenkins G M and Watts D G (1968) *Spectral Analysis and its Applications* Holden–Day

## 5 Arguments

1: **nx** – Integer *Input*

*On entry*: the length of the time series, $n$.

*Constraint*: **nx** $\geq 1$.

2: **mt_correction** – NagMeanOrTrend *Input*

*On entry*: whether the data are to be initially mean or trend corrected. **mt_correction** = Nag_NoCorrection for no correction, **mt_correction** = Nag_Mean for mean correction, **mt_correction** = Nag_Trend for trend correction.

*Constraint*: **mt_correction** = Nag_NoCorrection, Nag_Mean or Nag_Trend.

3: **px** – double *Input*

*On entry*: the proportion of the data (totalled over both ends) to be initially tapered by the split cosine bell taper. (A value of 0.0 implies no tapering).

*Constraint*: $0.0 \leq$ **px** $\leq 1.0$.

4: **mw** – Integer *Input*

*On entry*: the value of $M$ which determines the frequency width of the smoothing window as $2\pi/M$. A value of $n$ implies no smoothing is to be carried out.

*Constraint*: $1 \leq$ **mw** $\leq$ **nx**.

5: **pw** – double *Input*

*On entry*: the shape argument, $p$, of the trapezium frequency window.

A value of 0.0 gives a triangular window, and a value of 1.0 a rectangular window.

If **mw** = **nx** (i.e., no smoothing is carried out), then **pw** is not used.

*Constraint*: $0.0 \leq \mathbf{pw} \leq 1.0$. if $\mathbf{mw} \neq \mathbf{nx}$.

6: **l** – Integer *Input*

*On entry*: the frequency division, $L$, of smoothed spectral estimates as $2\pi/L$.

*Constraints*:

$\mathbf{l} \geq 1$;
**l** must be a factor of **kc** (see below).

7: **kc** – Integer *Input*

*On entry*: the order of the fast Fourier transform (FFT), $K$, used to calculate the spectral estimates. **kc** should be a multiple of small primes such as $2^m$ where $m$ is the smallest integer such that $2^m \geq 2n$, provided $m \leq 20$.

*Constraints*:

$\mathbf{kc} \geq 2 \times \mathbf{nx}$;
**kc** must be a multiple of **l**. The largest prime factor of **kc** must not exceed 19, and the total number of prime factors of **kc**, counting repetitions, must not exceed 20. These two restrictions are imposed by the internal FFT algorithm used.

8: **lg_spect** – Nag_LoggedSpectra *Input*

*On entry*: indicates whether unlogged or logged spectral estimates and confidence limits are required. **lg_spect** = Nag_Unlogged for unlogged. **lg_spect** = Nag_Logged for logged.

*Constraint*: **lg_spect** = Nag_Unlogged or Nag_Logged.

9: **x**[**kc**] – const double *Input*

*On entry*: the $n$ data points.

10: **g** – double ** *Output*

*On exit*: vector which contains the **ng** spectral estimates $\hat{f}(\omega_i)$, for $i = 0, 1, \ldots, [L/2]$, in **g**[0] to **g**[**ng** − 1] (logged if **lg_spect** = Nag_Logged). The memory for this vector is allocated internally. If no memory is allocated to **g** (e.g., when an input error is detected) then **g** will be **NULL** on return. If repeated calls to this function are required then NAG_FREE should be used to free the memory in between calls.

11: **ng** – Integer * *Output*

*On exit*: the number of spectral estimates, $[L/2] + 1$, in **g**.

12: **stats**[**4**] – double *Output*

*On exit*: four associated statistics. These are the degrees of freedom in **stats**[0], the lower and upper 95% confidence limit factors in **stats**[1] and **stats**[2] respectively (logged if **lg_spect** = Nag_Logged), and the bandwidth in **stats**[3].

13: **fail** – NagError * *Input/Output*

The NAG error argument (see Section 2.7 in How to Use the NAG Library and its Documentation).

# 6 Error Indicators and Warnings

**NE_2_INT_ARG_CONS**

On entry, **kc** $= \langle value \rangle$ while **l** $= \langle value \rangle$. These arguments must satisfy **kc%l** $= 0$ when **l** $> 0$.

On entry, **kc** $= \langle value \rangle$ while **nx** $= \langle value \rangle$. These arguments must satisfy **kc** $\geq 2 \times$ **nx** when **nx** $> 0$.

**NE_2_INT_ARG_GT**

On entry, **mw** $= \langle value \rangle$ while **nx** $= \langle value \rangle$. These arguments must satisfy **mw** $\leq$ **nx**.

**NE_ALLOC_FAIL**

Dynamic memory allocation failed.

**NE_BAD_PARAM**

On entry, argument **lg_spect** had an illegal value.

On entry, argument **mt_correction** had an illegal value.

**NE_CONFID_LIMIT_FACT**

The calculation of confidence limit factors has failed. Spectral estimates (logged if requested) are returned in **g**, and degrees of freedom and bandwith in **stats**.

**NE_FACTOR_GT**

At least one of the prime factors of **kc** is greater than 19.

**NE_INT_ARG_LT**

On entry, **l** $= \langle value \rangle$.
Constraint: **l** $\geq 1$.

On entry, **mw** $= \langle value \rangle$.
Constraint: **mw** $\geq 1$.

On entry, **nx** $= \langle value \rangle$.
Constraint: **nx** $\geq 1$.

On entry, **pw** must not be less than 0.0: **pw** $= \langle value \rangle$.

**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 contact NAG for assistance.

**NE_REAL_ARG_GT**

On entry, **pw** must not be greater than 1.0: **pw** $= \langle value \rangle$.

On entry, **px** must not be greater than 1.0: **px** $= \langle value \rangle$.

**NE_REAL_ARG_LT**

On entry, **px** must not be less than 0.0: **px** $= \langle value \rangle$.

**NE_SPECTRAL_ESTIM_NEG**

One or more spectral estimates are negative. Unlogged spectral estimates are returned in **g** and the degrees of freedom, unlogged confidence limit factors and bandwith in **stats**.

**NE_TOO_MANY_FACTORS**

**kc** has more than 20 prime factors.

## 7 Accuracy

The FFT is a numerically stable process, and any errors introduced during the computation will normally be insignificant compared with uncertainty in the data.

## 8 Parallelism and Performance

nag_tsa_spectrum_univar (g13cbc) is not threaded in any implementation.

## 9 Further Comments

nag_tsa_spectrum_univar (g13cbc) carries out a FFT of length **kc** to calculate the sample spectrum. The time taken by the function for this is approximately proportional to $\mathbf{kc} \times \log(\mathbf{kc})$ (but see Section 9 in nag_sum_fft_realherm_1d (c06pac) for further details).

## 10 Example

The example program reads a time series of length 131. It selects the mean correction option, a tapering proportion of 0.2, the option of no smoothing and a frequency division for logged spectral estimates of $2\pi/100$. It then calls nag_tsa_spectrum_univar (g13cbc) to calculate the univariate spectrum and prints the logged spectrum together with 95% confidence limits. The program then selects a smoothing window with frequency width $2\pi/30$ and shape argument 0.5 and recalculates and prints the logged spectrum and 95% confidence limits.

### 10.1 Program Text

```
/* nag_tsa_spectrum_univar (g13cbc) Example Program.
 *
 * NAGPRODCODE Version.
 *
 * Copyright 2016 Numerical Algorithms Group.
 *
 * Mark 26, 2016.
 *
 */

#include <nag.h>
#include <nag_stdlib.h>
#include <stdio.h>
#include <nagg13.h>

#define KCMAX 400
#define NXMAX KCMAX/2

int main(void)
{

  Integer exit_status = 0, i, kc, l, mw, ng, nx;
  NagError fail;
  double *g, pw, px, *stats = 0, *x = 0, *xh = 0;

  INIT_FAIL(fail);

  printf("nag_tsa_spectrum_univar (g13cbc) Example Program Results\n");
  /* Skip heading in data file */
#ifdef _WIN32
  scanf_s("%*[^\n] ");
#else
  scanf("%*[^\n] ");
#endif
```

```
#ifdef _WIN32
  scanf_s("%" NAG_IFMT " ", &nx);
#else
  scanf("%" NAG_IFMT " ", &nx);
#endif
  if (nx >= 1 && nx <= NXMAX) {
    if (!(stats = NAG_ALLOC(4, double)) ||
        !(x = NAG_ALLOC(KCMAX, double)) || !(xh = NAG_ALLOC(NXMAX, double))
           )
    {
      printf("Allocation failure\n");
      exit_status = -1;
      goto END;
    }
  }
  else {
    printf("Invalid nx.\n");
    exit_status = 1;
    return exit_status;
  }
  for (i = 1; i <= nx; ++i)
#ifdef _WIN32
    scanf_s("%lf ", &xh[i - 1]);
#else
    scanf("%lf ", &xh[i - 1]);
#endif
  px = 0.2;
  mw = nx;
  pw = 0.5;
  kc = KCMAX;
  l = 100;
#ifdef _WIN32
  while ((scanf_s("%" NAG_IFMT " ", &mw)) != EOF)
#else
  while ((scanf("%" NAG_IFMT " ", &mw)) != EOF)
#endif
  {
    if (mw > 0 && mw <= nx) {
      for (i = 1; i <= nx; ++i)
        x[i - 1] = xh[i - 1];

      /* nag_tsa_spectrum_univar (g13cbc).
       * Univariate time series, smoothed sample spectrum using
       * spectral smoothing by the trapezium frequency (Daniell)
       * window
       */
      nag_tsa_spectrum_univar(nx, Nag_Mean, px, mw, pw, l, kc, Nag_Logged,
                              x, &g, &ng, stats, &fail);
      if (fail.code != NE_NOERROR) {
        printf("Error from nag_tsa_spectrum_univar (g13cbc).\n%s\n",
               fail.message);
        exit_status = 1;
        goto END;
      }

      if (mw == nx)
        printf("\n No smoothing\n\n");
      else
        printf("\n Frequency width of smoothing window = "
               "1/%" NAG_IFMT "\n\n", mw);
      printf(" Degrees of freedom =%4.1f      Bandwidth =%7.4f\n\n",
             stats[0], stats[3]);
      printf(" 95 percent confidence limits -     Lower =%7.4f  "
             "Upper =%7.4f\n\n", stats[1], stats[2]);
      printf("       Spectrum       Spectrum       Spectrum"
             "       Spectrum\n");
      printf("       estimate       estimate       estimate"
             "       estimate\n\n");
      for (i = 1; i <= ng; ++i)
        printf("%5" NAG_IFMT "%10.4f%s", i, g[i - 1],
```

```
                (i % 4 == 0 ? "\n" : ""));
      printf("\n");
      NAG_FREE(g);
    }
  }
END:
  NAG_FREE(stats);
  NAG_FREE(x);
  NAG_FREE(xh);
  return exit_status;
}
```

## 10.2 Program Data

```
nag_tsa_spectrum_univar (g13cbc) Example Program Data
131
11.500  9.890  8.728  8.400  8.230  8.365  8.383  8.243
 8.080  8.244  8.490  8.867  9.469  9.786 10.100 10.714
11.320 11.900 12.390 12.095 11.800 12.400 11.833 12.200
12.242 11.687 10.883 10.138  8.952  8.443  8.231  8.067
 7.871  7.962  8.217  8.689  8.989  9.450  9.883 10.150
10.787 11.000 11.133 11.100 11.800 12.250 11.350 11.575
11.800 11.100 10.300  9.725  9.025  8.048  7.294  7.070
 6.933  7.208  7.617  7.867  8.309  8.640  9.179  9.570
10.063 10.803 11.547 11.550 11.800 12.200 12.400 12.367
12.350 12.400 12.270 12.300 11.800 10.794  9.675  8.900
 8.208  8.087  7.763  7.917  8.030  8.212  8.669  9.175
 9.683 10.290 10.400 10.850 11.700 11.900 12.500 12.500
12.800 12.950 13.050 12.800 12.800 12.800 12.600 11.917
10.805  9.240  8.777  8.683  8.649  8.547  8.625  8.750
 9.110  9.392  9.787 10.340 10.500 11.233 12.033 12.200
12.300 12.600 12.800 12.650 12.733 12.700 12.259 11.817
10.767  9.825  9.150
131
30
```

## 10.3 Program Results

```
nag_tsa_spectrum_univar (g13cbc) Example Program Results

 No smoothing

 Degrees of freedom = 2.0      Bandwidth = 0.0480

 95 percent confidence limits -     Lower =-1.3053  Upper = 3.6762

       Spectrum       Spectrum       Spectrum       Spectrum
       estimate       estimate       estimate       estimate

    1   -5.9354    2   -0.1662    3   -0.8250    4   -0.9452
    5    3.2137    6    0.2738    7   -1.0690    8   -1.0401
    9   -1.2388   10   -3.5434   11   -5.2568   12   -3.2450
   13   -2.4294   14   -3.9987   15   -2.9853   16   -4.6631
   17   -4.3317   18   -4.6982   19   -4.6335   20   -3.6732
   21   -5.8411   22   -4.7727   23   -3.9747   24   -4.8351
   25   -5.9979   26   -6.1169   27   -5.5245   28   -4.4774
   29   -5.6331   30   -4.0707   31   -4.6921   32   -5.6515
   33   -9.2919   34   -4.6302   35   -4.1700   36   -4.7829
   37   -6.6058   38   -5.8145   39   -5.2714   40   -5.8736
   41  -10.2188   42   -5.7887   43   -7.0751   44   -7.4055
   45   -8.2774   46   -7.8966   47   -6.4435   48   -5.7844
   49   -5.4690   50   -6.8709   51   -8.7123

 Frequency width of smoothing window = 1/30

 Degrees of freedom = 7.0      Bandwidth = 0.1767

 95 percent confidence limits -     Lower =-0.8275  Upper = 1.4213

       Spectrum       Spectrum       Spectrum       Spectrum
```

| | estimate | | estimate | | estimate | | estimate |
|---|---|---|---|---|---|---|---|
| 1 | -0.1776 | 2 | -0.4561 | 3 | -0.1784 | 4 | 1.9042 |
| 5 | 2.1094 | 6 | 1.7061 | 7 | -0.7659 | 8 | -1.4734 |
| 9 | -1.5939 | 10 | -2.1157 | 11 | -2.9151 | 12 | -2.7055 |
| 13 | -2.8200 | 14 | -3.4077 | 15 | -3.8813 | 16 | -3.6607 |
| 17 | -4.0601 | 18 | -4.4756 | 19 | -4.2700 | 20 | -4.3092 |
| 21 | -4.5711 | 22 | -4.8111 | 23 | -4.5658 | 24 | -4.7285 |
| 25 | -5.4386 | 26 | -5.5081 | 27 | -5.2325 | 28 | -5.0262 |
| 29 | -4.4539 | 30 | -4.4764 | 31 | -4.9152 | 32 | -5.8492 |
| 33 | -5.5872 | 34 | -4.9804 | 35 | -4.8904 | 36 | -5.2666 |
| 37 | -5.7643 | 38 | -5.8620 | 39 | -5.5011 | 40 | -5.7129 |
| 41 | -6.3894 | 42 | -6.4027 | 43 | -6.1352 | 44 | -6.5766 |
| 45 | -7.3676 | 46 | -7.1405 | 47 | -6.1674 | 48 | -5.8600 |
| 49 | -6.1036 | 50 | -6.2673 | 51 | -6.4321 | | |