# Exact expected branch lengths for Beta-coalescents

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#### **Abstract**

This code computes exact expected branch lengths for Beta-coalescents using recursions <sup>(1)</sup>. The incomplete Beta-coalescent is derived in <sup>(2)</sup>; if you use the results and/or the code please cite <sup>(2)</sup> when it comes out.

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## 2 Compilation, output and execution

This CWEB<sup>(?)</sup> document (the .w file) can be compiled with cweave to generate a .tex file, and with ctangle to generate a .c<sup>(?)</sup> file.

One can use cweave to generate a .tex file, and ctangle to generate a .c file. To compile the C++ code (the .c file), one needs the GNU Scientific Library (GSL).

```
Use splint to check the code:
```

```
splint ebikplusbeta_cweb.c
```

Use valgrind to check for memory leaks:

valgrind -v -leak-check=full -show-leak-kinds=all program call>

## 3 introduction

We consider  $\Lambda$ -coalescents with transition rates, for  $1 < \alpha < 2$  and  $2 \le k \le n$ , and C > 0 is a constant of proportionality,

$$\lambda_{n,k} = \binom{n}{k} \left( \mathbb{1}_{\{k=2\}} + \frac{C}{B(x; 2 - \alpha, \alpha)} \int_0^x t^{k - \alpha - 1} (1 - t)^{n - k + \alpha - 1} dt \right),\tag{1}$$

where  $B(x; 2 - \alpha, \alpha) = \int_0^x t^{1-\alpha} (1-t)^{\alpha-1} dt$ ,  $0 < x \le 1$ . We restrict to the case  $1 < \alpha < 2$  and (2)

$$x = \frac{K}{K + m_{\infty}} \tag{2}$$

where K > 0 is a constant and

$$m_{\infty} = 1 + \frac{2^{1-\alpha}}{\alpha - 1}.\tag{3}$$

Let  $B_i(n)$  denote the random length of branches supporting  $i \in \{1, ..., n-1\}$  leaves. The code computes the exact expected values  $\mathbb{E}[B_i(n)]$  using recursions<sup>(1)</sup>.

## 4 Code

#### 4.1 Includes

The included libraries.

```
5 \langle Includes 5\rangle \equiv
  #include <stdlib.h>
  #include <stdio.h>
  #include <string.h>
  #include <math.h>
  #include <assert.h>
  #include <gsl/gsl_rng.h>
  #include <gsl/gsl_randist.h>
  #include <gsl/gsl_vector.h>
  #include <gsl/gsl_matrix.h>
  #include <gsl/gsl_sf_pow_int.h>
  #include <gsl/gsl_errno.h>
  #include <gsl/gsl_sf_elementary.h>
  #include <gsl/gsl_sf_gamma.h>
  #include <gsl/gsl_fit.h>
  #include <gsl/gsl_multifit_nlin.h>
  #include <gsl/gsl_sf_exp.h>
  #include <gsl/gsl_sf_log.h>
  #include <gsl/gsl_sort.h>
  #include <gsl/gsl_statistics_double.h>
  #include <gsl/gsl_integration.h>
  #include <gsl/gsl_errno.h>
```

#### 4.2 The beta function

Compute the (incomplete) beta function

$$B(x;a,b) := \int_0^x t^{a-1} (1-t)^{b-1} dt$$
 (4)

for  $0 < x \le 1$  and a, b > 0.

6  $\langle \text{ beta function } 6 \rangle \equiv /* \text{ return the (incomplete) beta function} */$ 

static double betafunc (const double x, const double a, const double b)

```
\mathbf{return}\ (x < 1.\ ?\ gsl\_sf\_beta\_inc(a,b,x) * gsl\_sf\_beta(a,b) : gsl\_sf\_beta(a,b)); }
```

#### 4.3 The Beta-coalescent rate

Compute the total Beta-coal rate of merging blocks as in Eq (1).

```
7 \langle \text{ betarate } 7 \rangle \equiv
     static double lbetank(const size_t n, const size_t j, const double a, const double K)
           /* compute beta rate ; a is \alpha
            */ /* n is current number of blocks
                  /* j is number of blocks to merge
            */
        assert(n > 1);
        assert(j > 1);
        assert(j \leq n);
                        /* compute the cutoff Eq (2)
            */
        double x = (K > 0. ? K/(K + (1 + pow(2, 1. - a)/(a - 1.))) : 1.);
            /* compute the Beta-part of Eq (1)
             */
       return (gsl\_sf\_choose((unsigned) n, (unsigned) j) * betafunc(x, ((double)
            (j) - a, ((double) n) + a - ((double) j)) / betafunc(x, 2, -a, a));
     }
```

#### 4.4 The jump rate

Return the jump rate of jumping from i to j blocks using the rate in Eq (1).

This code is used in chunk 13.

}

#### 4.5 The jump matrices

Compute the matrices of jump rates and probabilities needed for the recursions (1).

9  $\langle$  compute jump matrices  $9 \rangle \equiv$ 

```
static void QP (const size_t n, const double a, const double K, const double
          Cconst, gsl\_matrix * Q, gsl\_matrix * P
      /* compute matrices qij and pij
       */
  size_{-}t i, j;
  double s = 0;
  double x = 0;
  for (i = 2; i \le n; ++i) {
    assert(i \leq n);
    s = 0.;
    for (j = 1; j < i; ++j) { /* compute the jump rate qij 4.4
       x = qij(i, j, a, K, Cconst);
       s = s + x;
       gsl\_matrix\_set(Q, i, j, x);
       gsl_matrix_set(P, i, j, x);
     }
    gsl_matrix_set(Q, i, i, s);
    for (j = 1; j < i; j ++) {
       assert(j < i);
       gsl_matrix_set(P, i, j, gsl_matrix_get(P, i, j)/s);
    }
  }
}
```

#### 4.6 Compute the g matrix

```
10 \langle compute g matrix 10\rangle \equiv
       static void gmatrix(const\ size\_t\ n, gsl\_matrix * G, gsl\_matrix * Q, gsl\_matrix * P)
       {
          size_t i, k, m;
          double s = 0.0;
                               /* initialise the diagonal */
         for (i = 2; i \le n; ++i) {
            gsl\_matrix\_set(G, i, i, 1./gsl\_matrix\_get(Q, i, i));
         for (i = 3; i \le n; ++i) {
            assert(i \leq n);
            for (m = 2; m < i; ++m) {
               s = 0.;
               for (k = m; k < i; ++k) {
                  assert(i \leq n);
                  assert(k \leq n);
                  assert(m \leq n);
                  s = s + gsl\_matrix\_get(P, i, k) * gsl\_matrix\_get(G, k, m);
               }
               gsl\_matrix\_set(G, i, m, s);
            }
          }
       }
```

#### **4.7** Compute the matrix $p^{(n)}[k,b]$

```
11 \langle compute pnkb 11 \rangle \equiv /* compute the matrix p^{(n)}[k,b]
                                        */
                       static void pnb(const size_t n, gsl_matrix * lkb, gsl_matrix * G, gsl_matrix * P)
                                            /* j is nprime from Prop A1 in paper
                                                                         /* lnb is the matrix p^{(nprime)}[k, b]; used for each fixed k
                                                */
                               gsl_matrix * lnb = gsl_matrix_calloc(n+1, n+1);
                               size_t k, b, j, i;
                               double s = 0.0;
                               gsl_matrix_set(lkb, n, 1, 1.0);
                               for (k = 2; k < n; k ++) {
                                       for (i = k; i \le n; i++) {
                                                for (b = 1; b \le i - k + 1; b ++) {
                                                         gsl_matrix_set(lnb, i, b, (k \equiv i? (b \equiv 1? 1.0: 0.0): 0.0));
                                                         s = 0.;
                                                        for (j = k; j < i; j ++) {
                                                                 (b) + (b > i - j)? (((\mathbf{double})(b - i + j)) * gsl_matrix_get(lnb, j),
                                                                                  b - i + j) * (gsl_matrix_get(P, 
                                                                                  (i, j) * gsl_matrix_get(G, j, k)/gsl_matrix_get(G, i, k))/((double))
                                                                                 (j) : 0.0 + (b < j) : (((\mathbf{double})(j - b)) * gsl_matrix_get(lnb, j, j)) : 0.0 + (b < j) : (((\mathbf{double})(j - b)) * gsl_matrix_get(lnb, j, j)) : 0.0 + (b < j) : (((\mathbf{double})(j - b)) * gsl_matrix_get(lnb, j, j)) : ((\mathbf{double})(j - b)) : ((\mathbf{double})(
                                                                                 b)*(gsl\_matrix\_get(P, i, j)*gsl\_matrix\_get(G, j, k)/gsl\_matrix\_get(G, i, k))
                                                                                  k))/((double) j))) : 0.0));
                                                         }
                                                 }
                                        }
                                       for (j = 1; j \le (n - k + 1); j ++)  {
```

#### 4.8 compute the expected spectrum

Compute the exact expected spectrum

12  $\langle \text{ compute ebi } 12 \rangle \equiv$ static void  $compute\_ebi(const size\_t n, const double a, const double K, const double$ Cconst) { /\* *n* is sample size; number of leaves \*/  $/* a is \alpha$ \*/ /\* K is the cutoff constant K/\* *Const* is the constant of proportionality *C* \*/  $gsl_matrix * P = gsl_matrix_calloc(n + 1, n + 1);$  $gsl_matrix * Q = gsl_matrix_calloc(n+1, n+1);$  $gsl_matrix * G = gsl_matrix_calloc(n+1, n+1);$  $gsl_matrix * Pn = gsl_matrix_calloc(n+1, n+1);$ /\* compute the Q and P matrices § 4.5 \*/ QP(n, a, K, Cconst, Q, P); /\* compute the g matrix § 4.6 \*/ gmatrix(n, G, Q, P); /\* compute pnb matrix § 4.7 \*/ pnb(n, Pn, G, P); $size_t b, k;$ **double** s = 0.0; **double** eb = 0.0; **double**  $*v_ebi = (double *) calloc(n, sizeof(double));$ **for** (b = 1; b < n; b ++) { s = 0.;

**for**  $(k = 2; k \le n - b + 1; k ++)$  {

```
s = s + (gsl\_matrix\_get(Pn, k, b) * ((double) k) * gsl\_matrix\_get(G, n, k));
    }
    v_ebi[b] = s;
    eb = eb + s;
       /* print out \mathbb{E}[B_i(n)]/\mathbb{E}[B(n)]
         */
  for (b = 1; b < n; ++b) {
    printf("%g\n", v_ebi[b]/eb);
      /* free memory
         */
  gsl_matrix_free(P);
  gsl_matrix_free(Q);
  gsl_matrix_free(G);
  gsl\_matrix\_free(Pn);
  free(v\_ebi);
}
```

#### 4.9 the main module

The main function for calling compute\_ebi § 4.8 .

```
13
       \langle Includes 5 \rangle /* see §4.1
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            */
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            */
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       ⟨compute g matrix 10⟩ /* §4.6
            */
       \langle compute pnkb 11 \rangle /* §4.7
            */
       \langle compute ebi 12\rangle /* §4.8
                 */
            int main(int argc, char *argv[])
            {
                  /* § 4.8
                    */
               compute\_ebi((size\_t) \ atoi(argv[1]), atof(argv[2]), atof(argv[3]), atof(argv[4]));
              return GSL_SUCCESS;
            }
```

## 5 references

## References

- [1] M Birkner, J Blath, and B Eldon. Statistical properties of the site-frequency spectrum associated with  $\Lambda$ -coalescents. *Genetics*, 195:1037–1053, 2013.
- [2] JA Chetwyn-Diggle, Bjarki Eldon, and Alison M. Etheridge. Beta-coalescents when sample size is large. in preparation.

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