# BayesMendel v2.1-8: An R package for cancer risk prediction

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## 1 Introduction

The BayesMendel working group is dedicated to the development of methodologies, models, and open source software for predicting who may carry a cancer susceptibility gene. We use statistical ideas that go back to Bayes and genetic models that go back to Mendel.

This vignette will show the user how to use BRCAPRO, MMRpro, PancPRO, MelaPRO and BRCAPANCpro to:

- Calculate probabilities of being a germline mutation carrier.
- Calculate future risk of cancer.
- Incorporate supplementary information (marker testing results, germline testing results, tumor information) into the models.

## 2 Using the models

#### 2.1 BRCAPRO

#### 2.1.1 Family History

Before running your pedigree through brcapro, be sure it is structured as a numeric data frame with history of breast and ovarian cancers: n rows (where n is the number of family members, including the counselee) and 13 columns with column names:

Column Name Content

ID Member identifier

Gender Gender (0=female, 1=male)
FatherID Father's identifier number
MotherID Mother's identifier number

AffectedBreast Breast cancer status (0=no cancer,

 $1{=}\mathrm{breast\ cancer}, one\ breast\ involved;\ 2{=}\mathrm{bilateral\ breast\ cancer},\ NA{=}\mathrm{unknown\ status})$ 

AffectedOvary Ovarian cancer status (0=no cancer, 1=ovarian cancer, NA=unknown status)

AgeBreast Age of onset of breast cancer if a breast cancer case.

Current age or age of death if not a breast cancer case.

NA if there is no age information.

Age Ovary Age of onset of ovarian cancer if an ovarian cancer case.

Current age or age of death if not an ovarian cancer case.

NA if there is no age information.

AgeBreastContralateral Age at onset of breast cancer, second breast.

Only for members with breast cancer status=2. For the rest enter a 0.

Twins Identifies siblings who are identical twins.

Each twin pair is identified by a unique number. For the rest enter a 0.

ethnic Identifies the ethnicity of each family member.

Enter "nonAJ", "AJ", "Italian", "Other" or NA (as recognized by is.na() function).

Death Vital Status (0=Alive, 1=Dead)

AgeDeath Family member's age at death or current age if alive.

If at least one family member is "AJ" the default is to use the prevalence associated with the "AJ" for family members with unknown ethnicity. Otherwise, the prevelance associated with "nonAJ" is used for family members with unknown ethnicity.

To begin using any BayesMendel models, load the package library:

#### > library(BayesMendel)

The parameters used by the model, including penetrance, allele frequency, and sensitivity/specificity of testing, are set using the function brcaparams. Any changes to the parameters can be made by calling this function.

- > # Change future risk to be calculated in intervals of 2 y instead of the default of 5 y.
- > # Leave all other parameters as set.
- > myparams <- brcaparams(age.by=2)</pre>
- > # Run BRCAPRO with family history information for example family
- > out = brcapro(family=brca.fam)
- [1] " Warning: age(s) older than age.max has been converted to age.max!"
- [1] "Warning: Unknown ages of some unaffected and affected family members have been imputed.

The probability of being a carrier is 0.2869353

an BRCA1 carrier 0.133169

an BRCA2 carrier 0.153731

The risks of developing cancers are

```
By age Breast Ca Risk Ovarian Ca Risk
     62
          0.04633821
                        0.02369181
2
          0.09087847
     67
                        0.04762882
3
    72
                      0.06961019
       0.13116310
     77 0.16541471
4
                       0.08831649
    82 0.19325081
5
                       0.10299490
```

### > slotNames(out)

- [1] "family" "posterior" "probs" "predictions"
- [5] "counselee.id" "loglik" "future.risk"

## > out@probs

## > out@family

	ID	Gender	${\tt FatherID}$	${\tt MotherID}$	${\tt AffectedBreast}$	AffectedOvary
1	1	0	3	2	0	0
2	2	0	9	8	0	1
3	3	1	11	10	0	0
4	4	0	0	1	0	0
5	5	1	3	2	0	0
6	6	0	0	0	0	0
7	7	0	3	2	1	0
8	8	0	0	0	0	1
9	9	1	0	0	0	0
10	10	0	0	0	0	0
11	11	1	0	0	0	0
12	12	0	9	8	0	0
13	13	0	9	8	0	0
14	14	0	11	10	1	0
15	15	1	5	6	0	0
16	16	1	0	7	0	0
17	17	0	0	7	0	0
18	18	0	0	7	0	0
19	19	0	0	7	0	0
20	20	0	21	12	0	0

21 21	1 0	0	(			0
22 22	0 9	8	2			0
23 23	0 0	22	(			0
24 24	1 5	6	(			0
25 25	1 5	6	(			0
_		AgeBreast	Contralateral			
	57 57		0	0	nonAJ	0
	70 69		0	1		0
	87 87		0	0		0
	32 32		0	0		0
	50 50		0	0		0
	57 57		0	0		0
	45 47		0	0		0
	65 65		0	0	nonAJ	0
	94 94 		0	0	nonAJ	0
	75 75		0	0	nonAJ	0
	94 94		0	0	nonAJ	0
	85 85		0	0		0
	79 79		0	0		0
14	1 70		0	0		0
	23 23		0	0	nonAJ	0
	12 12		0	0	nonAJ	0
	22 22		0	0	nonAJ	0
	19 19		0	0		0
	16 16		0	0		0
	54 54		0	0		0
	77 77		0	0		0
	40 70		45	1		0
	40 40		0	0	nonAJ	0
	17 17		0	2		0
	17 17		0	2	nonAJ	0
		_	AgeMastectomy	. –		
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5 5 S		(			(	
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13 7	9 8	C	) 1	L	(	J

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15	23	13		(	)			1		0
16	12	13		C	)			1		0
17	22	13		(	)			1		0
18	19	13		(	)			1		0
19	16	13		(	)			1		0
20	54	0		(	)			1		0
21	77	0		(	)			1		0
22	70	8		(	)			1		0
23	40	0		(	)			1		0
24	17	13		(	)			1		0
25	17	13		(	)			1		0
	AgeOophor	ectomy BRO	CA1	BRCA2	ER	PR	CK14	CK5.6	HER2	AgeCur
1		1	0	0	0	0	0	0	0	57
2		1	0	0	0	0	0	0	0	70
3		1	0	0	0	0	0	0	0	87
4		1	0	0	0	0	0	0	0	32
5		1	0	0	0	0	0	0	0	50
6		1	0	0	0	0	0	0	0	NA
7		1	0	0	0	0	0	O	0	47
8		1	0	0	0	0	0	O	0	65
9		1	0	0	0	0	0	0	0	94
10		1	0	0	0	0	0	O	0	75
11		1	0	0	0	0	0	O	0	94
12		1	0	0	0	0	0	O	0	85
13		1	0	0	0	0	0	O	0	79
14		1	0	0	0	0	0	O	0	NA
15		1	0	0	0	0	0	O	0	23
16		1	0	0	0	0	0	0	0	12
17		1	0	0	0	0	0	0	0	22
18		1	0	0	0	0	0	0	0	19
19		1	0	0	0	0	0	O	0	16
20		1	0	0	0	0	0	0	0	54
21		1	0	0	0	0	0	0	0	77
22		1	0	0	0	0	0	0	0	70
23		1	0	0	0	0	0	0	0	40
24		1	0	0	0	0	0	0	0	17
25		1	0	0	0	0	0	0	0	17
	AgeBreast	Lower Age	Brea	astUppe	er 1	Age	DvaryI	Lower	AgeOva	aryUpper
1		1		5	57			1		57
2		1		7	70			1		70
3		1		8	37			1		87
4		1		3	32			1		32
5		1		5	50			1		50
6		1		9	94			1		94

7	4	4.7	4	4.7
7	1	47	1	47
8	1	65	1	65 0.4
9	1	94	1	94
10	1	75	1	75 04
11	1	94	1	94
12	1	85	1	85
13	1	79	1	79
14	1	94	1	94
15	1	23	1	23
16	1	12	1	12
17	1	22	1	22
18	1	19	1	19
19	1	16	1	16
20	1	54	1	54
21	1	77	1	77
22	1	70	1	70
23	1	40	1	40
24	1	17	1	17
25	1	17	1	17
	BreastContralateral		astContralateral	
1		1		57 FALSE
2		1		70 FALSE
3		1		87 FALSE
4		1		32 FALSE
5		1		50 FALSE
6		1		94 TRUE
7		1		47 FALSE
8		1		65 FALSE
9		1		94 FALSE
10		1		75 FALSE
11		1		94 FALSE
12		1		85 FALSE
13		1		79 FALSE
14		1		94 TRUE
15		1		23 FALSE
16		1		12 FALSE
17		1		22 FALSE
18		1		19 FALSE
19		1		16 FALSE
20		1		54 FALSE
21		1		77 FALSE
22		1		70 FALSE
23		1		40 FALSE
24		1		17 FALSE
25		1		17 FALSE

### 2.2 Age Imputation

By default, brcapro imputes the ages of family members with unknown current or affected ages, denoted either by the user with NA (new as of v2.1) or value 1 (used in previous versions). Family members who are unaffected at an unknown age have their ages imputed using the approach taken in Lyte+ (see Biswas, S. Atienza, P., Chipman, J., Hughes, K., Gutierrez Barrera, A.M., Amos, C.I., Arun, B., Parmigiani, G. (2013) "Simplifying Clinical Use of the Genetic Risk Prediction Model BRCAPRO", Breast Cancer Research and Treatment, 139: 571-579.). Family members who are affected at an unknown age have their ages imputed using a multiple imputation approach that uses SEER incidence rates of breast and ovarian cancer to sample affection ages (bounded above by the individual's current age, if known). The imputation can be turned off by using the option imputeAges = FALSE in the brcapro function. Note that the imputation of relatives must also be turned off by using option imputeRelatives = FALSE in brcapro, because by default ages are imputed for relatives who are imputed. These options apply to models MMRpro, pancpro, and melapro. As of v2.1-7, users can now provide provide intervals for the imputation of affection ages by providing additional columns to the pedigree data frame. For brcapro, users can provide  $columns \ "AgeBreastLower", \ "AgeBreastUpper", \ "AgeOvaryLower", \ "AgeOvaryUpper", \$ BreastContralateralLower", and "AgeBreastContralateralUpper". Then the user can use the option bounds = TRUE (by default it is FALSE).

```
> # Turn off age imputation
> out <- brcapro(family=brca.fam, imputeAges=FALSE, imputeRelatives=FALSE)
> # Calculate risks with imputed ages
> out = brcapro(family=brca.fam, imputeAges=TRUE, imputeRelatives=TRUE)
```

- [1] " Warning: age(s) older than age.max has been converted to age.max!"
- [1] "Warning: Unknown ages of some unaffected and affected family members have been imputed. The probability of being a carrier is 0.2869312
  - an BRCA1 carrier 0.1331671
  - an BRCA2 carrier 0.1537299

The risks of developing cancers are

By age Breast Ca Risk Ovarian Ca Risk 1 62 0.04633764 0.02369136 2 67 0.09087743 0.04762793 3 72 0.13116170 0.06960892 4 77 0.16541306 0.08831492 5 82 0.19324896 0.10299309

- > # When age imputation is done, the original
- > #family (with NA inputs re-coded to

> #unaffected, age = 1) is returned by brcapro
> out@family

	ID	Gender	FatherID	MotherID	AffectedBreast	Affe	cted0va1	сy
1	1	0	3	2	0			0
2	2	0	9	8	0			1
3	3	1	11	10	0			0
4	4	0	0	1	0			0
5	5	1	3	2	0			0
6	6	0	0	0	0			0
7	7	0	3	2	1			0
8	8	0	0	0	0			1
9	9	1	0	0	0			0
10	10	0	0	0	0			0
11	11	1	0	0	0			0
12	12	0	9	8	0			0
	13	0	9	8	0			0
14	14	0	11	10	1			0
15	15	1	5	6	0			0
16	16	1	0	7	0			0
17	17	0	0	7	0			0
18	18	0	0	7	0			0
19	19	0	0	7	0			0
20	20	0	21	12	0			0
	21	1	0	0	0			0
	22	0	9	8	2			0
	23	0	0	22	0			0
	24	1	5	6	0			0
25	25	1	5	6	0			0
	Age			AgeBreast	Contralateral			Death
1		57	57		0	0	nonAJ	0
2		70	69		0	1	nonAJ	0
3		87	87		0	0		0
4		32	32		0	0		0
5		50	50		0	0	nonAJ	0
6		57	57		0	0	nonAJ	0
7		45	47		0	0	nonAJ	0
8		65	65		0	0		0
9		94	94		0	0		0
10		75	75		0	0	nonAJ	0
11		94	94		0	0	nonAJ	0
12		85 70	85		0	0	nonAJ	0
13		79	79 70		0	0	nonAJ	0
14		1	70		0	0	nonAJ	0
15		23	23		0	0	nonAJ	0

16	12							0		nonAJ
17	22							0		nonAJ
18	19							0		nonAJ
19	16							0		nonAJ
20	54							0		nonAJ
21	77							0		nonAJ
22	40							45		nonAJ
23	40							0		nonAJ
24	17							0		nonAJ
25	17							0		nonAJ
	AgeDeath		Mast	tectomy	γAξ	geMa	astec	tomy O	ophor	ectomy
1	57	1		(	)			1		0
2	70	4		(	)			1		0
3	87	4		(	)			1		0
4	32	3		(	)			1		0
5	50	2		(	)			1		0
6	NA	15		(	)			1		0
7	47	2		(	)			1		0
8	65	7		(	)			1		0
9	96	7		(	)			1		0
10	75	5		(	)			1		0
11	94	5		(	)			1		0
12	85	8		(	)			1		0
13	79	8		(	)			1		0
14	NA	6		(	)			1		0
15	23	13		(	)			1		0
16	12	13		(	)			1		0
17	22	13		(	)			1		0
18	19	13		(	)			1		0
19	16	13			)			1		0
20	54	0			)			1		0
21	77	0			)			1		0
22	70	8			)			1		0
23	40	0		(	)			1		0
24	17	13		(	)			1		0
25	17	13		(	)			1		0
	AgeOophor		CA1	BRCA2	ER.	PR.	CK14		HER2	
1	8I	1	0	0	0	0	0	0	0	_
2		1	0	0	0	0	0	0	0	
3		1	0	0	0	0	0	0	0	
4		1	0	0	0	0	0	0	0	
5		1	0	0	0	0	0	0	0	
6		1	0	0	0	0	0	0	0	
7		1	0	0	0	0	0	0	0	
8		1	0	0	0	0	0	0	0	
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25
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   AgeBreastLower AgeBreastUpper AgeOvaryLower AgeOvaryUpper
1
                                     57
                                                       1
2
                    1
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                                                                       70
3
                                     87
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                                                       1
4
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                    1
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5
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                                                                       50
6
                    1
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7
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                                                       1
8
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                                                       1
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9
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                                                                       40
24
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                                                                       17
25
                    1
                                     17
                                                       1
   AgeBreastContralateralLower AgeBreastContralateralUpper uua2
```

57 FALSE

```
2
                                 1
                                                               70 FALSE
3
                                 1
                                                               87 FALSE
4
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                                                               32 FALSE
5
                                                               50 FALSE
                                 1
6
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                                 1
7
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                                 1
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                                 1
9
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                                                               94 FALSE
10
                                 1
                                                               75 FALSE
                                                               94 FALSE
11
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12
                                 1
                                                               85 FALSE
                                                               79 FALSE
13
                                 1
                                                               94 TRUE
14
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15
                                 1
                                                               23 FALSE
                                                               12 FALSE
16
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17
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                                                               22 FALSE
18
                                                               19 FALSE
                                 1
                                                               16 FALSE
19
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20
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21
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                                                               77 FALSE
22
                                 1
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23
                                                               40 FALSE
                                 1
                                                               17 FALSE
24
                                 1
25
                                 1
                                                               17 FALSE
```

- [1] "Warning: age(s) older than age.max has been converted to age.max!"
- [1] "Warning: Unknown ages of some unaffected and affected family members have been imputed. The probability of being a carrier is 0.2869422
  - an BRCA1 carrier 0.1331724
- an BRCA2 carrier 0.1537325

The risks of developing cancers are

By age Breast Ca Risk Ovarian Ca Risk

	•	_		
1		62	0.04633919	0.02369261
2		67	0.09088024	0.04763038
3		72	0.13116546	0.06961240
4		77	0.16541752	0.08831923
5		82	0.19325394	0.10299803

- > # Use lower and upper bounds for imputing affection ages
- > fam <- brca.fam
- > fam\$AgeBreastLower <- fam\$AgeBreast

<sup>&</sup>gt; # Can also impute ages, but not relatives.

<sup>&</sup>gt; out = brcapro(family=brca.fam, imputeAges=TRUE, imputeRelatives=FALSE)

```
> fam$AgeBreastUpper <- fam$AgeBreast
> fam$AgeOvaryLower <- fam$AgeOvary</pre>
> fam$AgeOvaryUpper <- fam$AgeOvary</pre>
> fam$AgeBreastContralateralLower <- fam$AgeBreastContralateral
> fam$AgeBreastContralateralUpper <- fam$AgeBreastContralateral
> fam$AgeBreastLower[14] <- 40
> fam$AgeBreastUpper[14] <- 50</pre>
> fam$AgeOvary[2] <- NA</pre>
> fam$AgeOvaryLower[2] <- 50</pre>
> fam$AgeOvaryUpper[2] <- 60</pre>
> out = brcapro(family=fam, bounds=TRUE)
[1] "Warning: age(s) older than age.max has been converted to age.max!"
[1] "Warning: Unknown ages of some unaffected and affected family members have been imputed.
The probability of being a carrier is 0.2805121
 an BRCA1 carrier 0.1675303
 an BRCA2 carrier 0.1129256
The risks of developing cancers are
  By age Breast Ca Risk Ovarian Ca Risk
1
      62
             0.04524058
                             0.02607270
             0.08904205
2
      67
                              0.05188428
3
      72
             0.12875208
                              0.07513883
      77
             0.16250876
                              0.09466697
5
      82
             0.18993962
                              0.10997848
```

## 2.2.1 Changing the penetrance or prevalence

Generally, the user can specify the prevalence of BRCA1 and BRCA2 directly in the pedigree through the "ethnic" column.

The user can input their own values for prevalence by specifying ethnic = "Other" and inputting the values using the brcaparams function.

The user can also specify the net and crude penetrance estimates to be used by brcapro. The default net penetrance is the penet.brca.net object, and the default crude pentrance is penet.brca.crude. To use the penetrance estimates for the Italian population as the net penetrance, we can use brcaparams:

```
> myparams <- brcaparams(penetrance.net = BRCApenet.Italian.2008)
> out <- brcapro(family=brca.fam, params=myparams)</pre>
```

```
[1] " Warning: age(s) older than age.max has been converted to age.max!"
```

[1] "Warning: Unknown ages of some unaffected and affected family members have been imputed. The probability of being a carrier is 0.3202517

```
an BRCA1 carrier 0.1785152
 an BRCA2 carrier 0.1416712
The risks of developing cancers are
 By age Breast Ca Risk Ovarian Ca Risk
1
      62
             0.04974193
                              0.02863679
2
      67
             0.09732302
                              0.05712815
      72
                              0.08291403
             0.14002909
4
      77
             0.17614693
                              0.10463543
5
      82
             0.20550192
                              0.12166739
```

#### 2.2.2 Specifying race/ethnicity of the family

A set of race/ethnicity-specific baseline (non-carrier) penetrance values were recently added to brcapro. The current default assumes that the race/ethnicity of the input family is unknown, but the user can specify one of five different inputs: Asian, Black, Hispanic, NativeAmerican and White. Race/ethnicity categories and estimates were derived using the DevCan (http://srab.cancer.gov/devcan/) software provided by the National Cancer Institute (NCI). To specify a particular race, use the "race" input option in brcapro.

```
> out <- brcapro(family=brca.fam, race="Hispanic")</pre>
```

```
[1] "Warning: age(s) older than age.max has been converted to age.max!"
[1] "Warning: Unknown ages of some unaffected and affected family members have been imputed.
The probability of being a carrier is 0.2900113
an BRCA1 carrier 0.1349715
an BRCA2 carrier 0.1549969
```

The risks of developing cancers are

```
By age Breast Ca Risk Ovarian Ca Risk
1
      62
              0.04387991
                               0.02341315
      67
2
              0.08554593
                               0.04710024
3
      72
              0.12238862
                               0.06888901
4
      77
              0.15342498
                               0.08751894
5
      82
              0.17864897
                               0.10234033
```

#### 2.2.3 Germline Testing Results

If the results for *BRCA1* and *BRCA2* germline testings are available, the user can input the results in data frame germline.testing (0=no test, 1=positive test, 2=negative test) with column names "BRCA1" and "BRCA2".

```
> # Add the testing results for BRCA1 and BRCA2
```

<sup>&</sup>gt; BRCA1 <- BRCA2 <- rep(0,nrow(brca.fam))

```
> germline.testing <- data.frame(BRCA1,BRCA2)</pre>
> germline.testing[2,] \leftarrow c(2,0)
> out <- breapro(family=brea.fam, germline.testing=germline.testing)
[1] " Warning: age(s) older than age.max has been converted to age.max!"
[1] "Warning: Unknown ages of some unaffected and affected family members have been imputed.
The probability of being a carrier is 0.307824
an BRCA1 carrier 0.000142593
an BRCA2 carrier 0.3076402
The risks of developing cancers are
  By age Breast Ca Risk Ovarian Ca Risk
1
      62
             0.05013483
                              0.01431292
2
                              0.03080316
      67
             0.09715897
3
      72
             0.13936864
                              0.04765945
4
      77
             0.17529789
                              0.06300435
5
      82
             0.20450742
                              0.07508979
```

#### 2.2.4 Marker Testing Results

If the results for *BRCA1* prognostic markers are available, the user can input the results in data frame marker.testing with column names shown below. Note that even if not all the biomarker results listed below are available, all 4 columns must contain non-missing values, which should be set to zero for biomarkers that were not tested.

Column Name	Content
$\operatorname{ER}$	ER testing result. (0=no test, 1=positive test, 2=negative test)
CK14	CK14 testing result. (0=no test, 1=positive test, 2=negative test)
CK5.6	CK5/6 testing result. (0=no test, 1=positive test, 2=negative test)
PR	PR testing result. (0=no test, 1=positive test, 2=negative test)
HER2	HER2 testing result. (0=no test, 1=positive test, 2=negative test)

When the testing result for ER is negative, and the results for CK14 and CK5/6 are both also available, these 3 markers are treated as a group, and the calculations of carrier probabilities will incorporate the joint conditional probabilities of them given genetic status. If the result for either CK14 or CK5/6 is not available, the calculations of carrier probabilities will involve either the marginal conditional probability of ER given genetic status, or if HER2 testing is available, the joint conditional probability of ER and HER2 given genetic status. Note that when ER is positive, the testing results for CK14 or CK5/6 are not considered. For any family member, if the testing result for ER is available, the testing result for PR will be ignored even if it is also available. That is, PR will not be included in carrier prediction when ER is available. PR will only be used when either PR only or PR and HER2 testing are available.

```
> # Add the testing results for breast cancer markers
> marker.testing <- data.frame(matrix(rep(0,nrow(brca.fam)*5),ncol=5))</pre>
```

```
> colnames(marker.testing) <- c("ER", "CK14", "CK5.6", "PR", "HER2")
> brca.fam[1,"AffectedBreast"] <- 1</pre>
> marker.testing[1,"ER"] <- 2</pre>
> out <- brcapro(family=brca.fam, germline.testing=germline.testing, marker.testing=marker.te
[1] "Warning: age(s) older than age.max has been converted to age.max!"
[1] "Warning: Unknown ages of some unaffected and affected family members have been imputed.
The probability of being a carrier is 0.8129797
 an BRCA1 carrier 0.0009915951
 an BRCA2 carrier 0.8113751
The risks of developing cancers are
  By age Contralateral Breast Ca Risk Ovarian Ca Risk
1
      62
                           0.04514924
                                            0.03623374
2
      67
                           0.10869654
                                            0.07797797
3
      72
                           0.18523087
                                            0.12058843
4
      77
                           0.25944721
                                            0.15932034
```

0.18979158

#### 2.2.5Oophorectomy

82

5

If women in the pedigree have had an oophorectomy, this information can be included in the calculation by creating a data frame oophorectomy. Set up a data frame with two columns, one indicating if oophorectomy was done and the other with the age at oophorectomy. If no oophorectomy was done, an individual's current age should be used.

0.32018518

# Column Name Oophorectomy Oophorectomy yes/no. (0=no oophorectomy, 1=oophorectomy) AgeOophorectomy Age at Oophorectomy. > # Add the information for oophorectomy > Oophorectomy <- c(1,rep(0,(nrow(brca.fam)-1)))</pre> > AgeOophorectomy <- c(30,rep(1,(nrow(brca.fam)-1)))</pre> > oophorectomy <- data.frame(Oophorectomy,AgeOophorectomy)</pre> > out <- brcapro(family=brca.fam, germline.testing=germline.testing, marker.testing=marker.te [1] "Warning: age(s) older than age.max has been converted to age.max!" [1] "Warning: Unknown ages of some unaffected and affected family members have been imputed.

```
The probability of being a carrier is 0.8328211
an BRCA1 carrier 0.001533733
an BRCA2 carrier 0.8305426
The risks of developing cancers are
  By age Contralateral Breast Ca Risk Ovarian Ca Risk
      62
                           0.04561752
                                          0.009709741
2
      67
                           0.11018288
                                          0.020898338
```

Content

3	72	0.18811268	0.032319371
4	77	0.26373655	0.042700655
5	82	0.32563699	0.050867857

#### 2.2.6 Mastectomy

If an individual in the pedigree has had a bilateral mastectomy, this information can be included in the calculation by creating a data frame mastectomy. Set up a data frame with two columns, one indicating if mastectomy was done and the other with the age at mastectomy. If no mastectomy was done, an individual's current age should be used. Only bilateral mastectomy should be included, and not mastectomy performed on only one breast.

## Column Name Content Mastectomy Mastectomy yes/no. (0=no mastectomy, 1=mastectomy) AgeMastectomy Age at Mastectomy. > # Add the information for mastectomy

- > Mastectomy <- c(1,rep(0,(nrow(brca.fam)-1)))</pre>
- > AgeMastectomy <- c(57,rep(1,(nrow(brca.fam)-1)))</pre>
- > mastectomy <- data.frame(Mastectomy, AgeMastectomy)</pre>
- > out <- brcapro(family=brca.fam, mastectomy=mastectomy)

```
[1] " Warning: age(s) older than age.max has been converted to age.max!"
```

[1] "Warning: Unknown ages of some unaffected and affected family members have been imputed. The probability of being a carrier is 0.8101098

```
an BRCA1 carrier 0.3548522
```

an BRCA2 carrier 0.4550434

The risks of developing cancers are

	Ву	age	Contralateral	Breast Ca Risk	Ovarian Ca Risk
1		62		0.04780295	0.06341081
2		67		0.10688149	0.12754977
3		72		0.17118867	0.18644464
4		77		0.23101200	0.23653455
5		82		0.27927401	0.27580621

#### **MMRpro**

#### Family History 2.3.1

Before running your pedigree through MMRpro, be sure it is structured as a numeric data frame with history of colon and endometrial cancers: n rows (where n is the number of family members, including the counselee) and 8 columns with required column names described below. The family history includes the information on the counselee and his/her relatives. For each member, we need information on whether he or she has been diagnosed with colorectal cancer and either the age at diagnosis or, if cancer free, the current age or the age at death. We do the same for endometrial cancer, if the member is female.

The family cancer history must be entered in data frame form, with one row for each family member and columns containing the following information:

Column	Content
ID	Member identifier
Gender	Gender (0=female, 1=male)
FatherID	Father's identifier number
MotherID	Mother's identifier number
AffectedColon	Colorectal cancer status
	(0=no cancer,1=colon/rectum cancer,NA=no information)
Affected Endometrium	Endometrial cancer status
	(0=no cancer, 1=ovarian cancer, NA=no information)
AgeColon	Age of onset of colorectal cancer if a colorectal cancer case.
	Current age or age of death if not a colorectal cancer case.
	NA if there is no age information.
AgeEndometrium	Age of onset of endometrial cancer if an endometrial cancer case.
	Current age or age of death if not an endometrial cancer case.
	NA if there is no age information.
Twins	Identifies siblings who are identical twins.
	Each twin pair is identified by a unique number. For the rest enter a 0.

If it is known that a family member is affected, but age of diagnosis is unknown, either enter an estimate or evaluate the program at different plausible ages.

The parameters used by the model, including penetrance, allele frequency, and sensitivity/specificity of testing, are set using the function MMRparams. Any changes to the parameters can be made by calling this function.

```
> # Change future risk to be calculated up to age 95 instead of the default 85.
> # Leave all other parameters as set.
> myparams <- MMRparams(age.to=95)
> # Run MMRpro with family history information for example family
> out = MMRpro(family=MMR.fam, params=myparams)
```

```
> # Run MMRpro with family history information for example family
> out = MMRpro(family=MMR.fam, params=myparams)

[1] "Warning: individuals have an unknown age of diagnosis. The calculation would be improve
The probability of being a carrier is 0.01904266
an MLH1 carrier 0.008184038
an MSH2 carrier 0.009534781
an MSH6 carrier 0.001330323
The risks of developing cancers are
   By age Colorectal Ca Risk Endometrial Ca Risk
1 60 0.004016592 0.005523277
```

```
2
      65
                 0.008640795
                                      0.010706530
3
      70
                 0.014118479
                                      0.014671650
4
      75
                 0.020210281
                                      0.017895306
5
      80
                 0.026910326
                                      0.020414861
6
      85
                 0.033441145
                                      0.022071694
7
      90
                 0.038568851
                                      0.022886836
      95
```

>

#### 2.3.2 Germline Testing

Information about germline testing results is included in the germline.testing object. If the results of germline testing are available, the user can input them into a data frame with n rows and 4 columns with column names "MLH1", "MSH2", and "MSH6" which stores the mutation testing results for *MLH1*, *MSH2*, and *MSH6* (0=no test, 1=positive test, 2=negative test).

```
> ## The counselee's father tested negative for MLH1 and MSH2.
> ## No testing for MSH6 was done.
> MLH1 <- MSH2 <- MSH6 <- rep(0, nrow(MMR.fam))</pre>
```

- > germline.testing = data.frame(MLH1, MSH2, MSH6)
- > germline.testing[3,]  $\leftarrow c(2,2,0)$
- > out <- MMRpro(family=MMR.fam, germline.testing = germline.testing)

[1] "Warning: individuals have an unknown age of diagnosis. The calculation would be improve The probability of being a carrier is 0.001556468

```
an MLH1 carrier 2.154079e-05
```

an MSH2 carrier 2.014245e-05

an MSH6 carrier 0.001514848

The risks of developing cancers are

	By age	Colorectal Ca Risk	Endometrial Ca Risk
1	60	0.002893740	0.002650113
2	65	0.006417918	0.006084631
3	70	0.010870094	0.009673106
4	75	0.016050585	0.012896007
5	80	0.022011470	0.015437592
6	85	0.028025535	0.017108443

>

## 2.3.3 Marker Testing

Information about the colorectal tumor is included in the marker.testing object. This object is a data frame with n rows and 2 columns with information about MSI testing and location of the colorectal tumor. For more information on determining MSI, please refer to Boland (1998). If immunohistochemistry (IHC) was performed, enter 1 if any protein expression was shown to be abnormal or 2 if all were normal.

```
Column Name
                     Content
    MSI
                     Microsatellite instability result
                     enter 1 if high instability is present
                     2 if low instability or stability is present, or
                     0 if no MSI test has been performed.
    location
                     Location of the colorectal tumor:
                     enter 1 if found in the proximal colon
                     2 if found in the distal colon, or
                     0 if the location of the tumor is unknown.
> ## Now let's say the counselee's sister has a colorectal tumor
> MMR.fam[7, "AffectedColon"] <- 1</pre>
> ## The counselee's sister's tumor was found to be MSI high.
> ## Add in this MSI result.
> MSI <- location <- rep(0, nrow(MMR.fam))</pre>
> marker.testing <- data.frame(MSI, location)</pre>
> marker.testing[7, "MSI"] <- 1</pre>
> out <- MMRpro(family = MMR.fam, marker.testing = marker.testing)</pre>
[1] "Warning: individuals have an unknown age of diagnosis. The calculation would be improve
The probability of being a carrier is 0.3370197
 an MLH1 carrier 0.1482241
 an MSH2 carrier 0.1821491
 an MSH6 carrier 0.00683245
The risks of developing cancers are
  By age Colorectal Ca Risk Endometrial Ca Risk
      60
                   0.02402179
1
                                         0.05691384
2
      65
                   0.04826763
                                         0.09380106
3
      70
                   0.07206843
                                         0.10527552
4
      75
                   0.09447800
                                         0.10916059
5
```

6

80

85

0.11443344

0.13023883

0.11171766

0.11338429

#### 2.4 PancPRO

#### 2.4.1 Family History

Before running your pedigree through pancpro, be sure it is structured as a numeric data frame with history of pancreas cancer: n rows (where n is the number of family members, including the counselee) and 6 columns with required column names described below.

The family history includes the information on the counselee and his/her relatives. For each member, we need information on whether he or she has been diagnosed with pancreatic cancer and either the age at diagnosis or, if cancer free, the current age or the age at death.

The family cancer history must be entered in data frame form, with one row for each family member and columns containing the following information:

Column	Content
ID	Member identifier
Gender	Gender (0=female, 1=male)
FatherID	Father's identifier number
MotherID	Mother's identifier number
AffectedPancreas	Pancreatic cancer status
	(0=no cancer, 1=pancreatic cancer, NA=no information)
AgePancreas	Age of onset of pancreatic cancer if a pancreas cancer case.
	Current age or age of death if not a pancreas cancer case.
	NA if there is no age information.
Twins	Identifies siblings who are identical twins.
	Each twin pair is identified by a unique number. For the rest enter a 0.

If it is known that a family member is affected, but age of diagnosis is unknown, either enter an estimate or evaluate the program at different plausible ages.

The parameters used by the model, including penetrance, allele frequency, and sensitivity/specificity of testing, are set using the function pancparams. Any changes to the parameters can be made by calling this function.

- > # Change the output for future risk to be calculated
  > # in age intervals of 1 year up to
  > # age 65 instead of the default 5 years.
  > # Leave all other parameters as set.
  > myparams <- pancparams(age.by=1, age.to=65)
  > # Run PancPRO with family history information for example family
  > pancpro(family=panc.fam, params=myparams)
- [1] "Warning: individuals have an unknown age of diagnosis. The calculation would be improve The probability of being a carrier is 0.4168366

  The risks of developing cancers are

Е	By ag	ge Pancre	eatic Ca	a Risl	ζ					
1		58	0.0030							
2	5	59	0.0062	246162	2					
3	6	30	0.009	733784	1					
4	6	31	0.0134	461607	7					
5	6	32	0.0174	422679	9					
6	6	3	0.0216	307807	7					
7	6	34	0.0259	998944	1					
8	6	55	0.030	572112	2					
An	obje	ct of c	Lass "Ba	ayesMe	ende.	l"				
Slo	t "f	amily":								
	ID R	Relation	Gender	Fathe	erID	Moth	erID <i>I</i>	Afí	fectedPar	creas
1	1	1	0		3		2			0
2	2	4	0		9		8			0
3	3	4	1		11		10			0
4	4	3	0		0		1			0
5	5	2	1		3		2			0
6	6	15	0		0		0			0
7	7	2	0		3		2			1
8	8	7	0		0		0			0
9	9	7	1		0		0			0
10	10	5	0		0		0			0
11	11	5	1		0		0			0
12	12	8	0		9		8			0
13	13	8	0		9		8			0
14	14	6	0		11		10			1
15	15	13	1		5		6			0
16	16	13	1		0		7			0
17	17	13	0		0		7			0
18	18	13	0		0		7			0
19	19	13	0		0		7			0
	AgeF	ancreas			AgeI				_	
1		57	1	0		57	Par		57	
2		70	0	0		70	Par		70	
3		87	0	0		87	Par		87	
4		32	0	0		32	Par		32	
5		50	0	0		50	Par		50	
6		57	0	0		NA	Par		NA	
7		45	1	0		45	Par		NA	
8		65	0	0		65	Par		65	
9		94	0	0		96	Par		94	
10		75	0	0		75	Par		75	
11		94	0	0		94	Par		94	
12		85	0	0		85	Par	nc	85	

Panc

14	1	0	0	NA	Panc	NA			
15	23	0	0	23	Panc	23			
16	12	0	0	12	Panc	12			
17	22	0	0	22	Panc	22			
18	19	0	0	19	Panc	19			
19	16	0	0	16	Panc	16			
AgeP	ancreasLow	er Ag	ePancre	asUpper					
1		1		57					
2		1		70					
3		1		87					
4		1		32					
5		1		50					
6		1		94					
7		1		94					
8		1		65					
9		1		94					
10		1		75					
11		1		94					
12		1		85					
13		1		79					
14		1		94					
15 16		1		23					
16 17		1 1		12 22					
18		1		19					
19		1		16					
13		1		10					
Slot "p	osterior":								
	PANCO	PANC	1	PANC2					
[1,] 0.	5831634 0.								
	robs": ng a carri 0.4168								
_	redictions e Pancreat 8 (								

0.006246162

0.009733784

0.013461607

0.017422679

0.021607807

0.025998944

0.030572112

```
Slot "counselee.id":
[1] 1
Slot "loglik":
NULL
Slot "future.risk":
           hFX0
                      hFX1
  0.000000000 0.00000000
  0.000000000 0.00000000
  0.000000000 0.00000000
  0.000000000 0.000000000
  0.000000000 0.000000000
  0.000000000 0.000000000
  0.000000000 0.000000000
  0.000000000 0.000000000
  0.000000000 0.00000000
10 0.000000000 0.000000000
11 0.000000000 0.000000000
12 0.000000000 0.000000000
13 0.000000000 0.000000000
14 0.000000000 0.000000000
15 0.000000000 0.000000000
16 0.000000000 0.000000000
17 0.000000000 0.000000000
18 0.000000000 0.000000000
19 0.000000000 0.000000000
20 0.0000000000 0.000000000
21 0.0000000000 0.000000000
22 0.000000000 0.000000000
23 0.000000000 0.000000000
24 0.000000000 0.000000000
25 0.000000000 0.000000000
26 0.000000000 0.000000000
27 0.000000000 0.000000000
28 0.0000000000 0.000000000
29 0.000000000 0.000000000
30 0.0000000000 0.000000000
31 0.000000000 0.000000000
32 0.0000000000 0.000000000
33 0.0000000000 0.000000000
34 0.0000000000 0.000000000
35 0.0000000000 0.000000000
36 0.0000000000 0.000000000
```

```
37 0.0000000000 0.000000000
38 0.000000000 0.000000000
39 0.000000000 0.000000000
40 0.000000000 0.000000000
41 0.000000000 0.000000000
42 0.000000000 0.000000000
43 0.0000000000 0.000000000
44 0.000000000 0.000000000
45 0.000000000 0.000000000
46 0.0000000000 0.000000000
47 0.000000000 0.000000000
48 0.000000000 0.000000000
49 0.000000000 0.000000000
50 0.000000000 0.000000000
51 0.000000000 0.000000000
52 0.000000000 0.000000000
53 0.000000000 0.000000000
54 0.000000000 0.000000000
55 0.000000000 0.000000000
56 0.000000000 0.000000000
57 0.000000000 0.000000000
58 0.0001467817 0.006996109
59 0.0003072760 0.014554791
60 0.0004811673 0.022678395
61 0.0006681923 0.031359872
62 0.0008692960 0.040581221
63 0.0010912961 0.050310849
64 0.0013350476 0.060504270
65 0.0016002603 0.071104360
```

>

#### 2.4.2 Germline and Marker Testing

Because the PANC gene is a hypothetical gene, there are no germline or marker testing results to add to the calculation.

#### 2.5 MelaPRO

#### 2.5.1 Family History

Before running your pedigree through melapro, be sure it is structured as a numeric data frame with history of melanomas: n rows (where n is the number of family members, including

the counselee) and 6 columns with required column names described below.

The family history includes the information on the counselee and his/her relatives. For each member, we need information on whether he or she has been diagnosed with melanoma and either the age at diagnosis or, if cancer free, the current age or the age at death.

The family cancer history must be entered in data frame form, with one row for each family member and columns containing the following information:

$\mathbf{Column}$	Content
ID	Member identifier
Gender	Gender (0=female, 1=male)
FatherID	Father's identifier number
MotherID	Mother's identifier number
AffectedSkin	Number of diagnosed melanomas
	0=no cancer,1=single melanoma, 2=multiple melanomas, NA=no information
AgeSkin	Age of onset of melanomas if a cancer case.
	Current age or age of death if not a cancer case.
	NA if there is no age information.
Twins	Identifies siblings who are identical twins.
	Each twin pair is identified by a unique number. For the rest enter a 0.

If it is known that a family member is affected, but age of diagnosis is unknown, either enter an estimate or evaluate the program at different plausible ages.

The parameters used by the model, including penetrance, allele frequency, and sensitivity/specificity of testing, are set using the function melaparams. Any changes to the parameters can be made by calling this function.

- > # Change likelihood ratio for single melanomas
- > # among noncarriers from default 0.702 to 0.80
- > myparams <- melaparams(spm.lr.noncarrier=0.80)</pre>
- > # Run PancPRO with family history information for example family
- > melapro(family=mela.fam, params=myparams)

[1] "Warning: individuals have an unknown age of diagnosis. The calculation would be improve The probability of being a carrier is 0.1204639

The risk of developing cancer is

	Ву	age	Melanoma Risk
1		35	0.01116896
2		40	0.02295988
3		45	0.03501317
4		50	0.04710430
5		55	0.05901270
6		60	0.07047355
7		65	0.08147133
8		70	0.09176121

9		75	0.1008	8929								
10		80	0.1085	0.10850911								
11		85	0.1142	0.11429754								
An	obj	ject of	class	"BayesMe	ndel	."						
Slo	ot '	'family	":									
	ID	Gender	Father	ID Mothe	rID	Affected	dSkin	${\tt AgeSkin}$	${\tt Twins}$	Death		
1	1	0		2	3		0	30.0	0	0		
2	2	1		20	21		1	40.0	0	0		
3	3	0		11	12		0	36.0	0	0		
4	4	0		2	3		1	29.0	0	0		
5	5	0		2	3		0	50.0	0	0		
6	6	1		0	1		0	24.0	0	0		
7	7	0		0	1		0	23.0	0	0		
8	8	1		0	1		0	20.0	0	0		
9	9	0		0	5		0	26.0	0	0		
10	10	0		0	5		0	22.0	0	0		
11	11	1		0	0		0	63.0	0	0		
	12	0		0	0		0	92.0	0	0		
	13	1		11	12		0	64.0	0	0		
14	14	1		11	12		0	74.0	0	0		
15	15	0		14	0		1	1.0	0	0		
16	16	0		14	0		0	30.0	0	0		
17	17	1		14	0		0	30.0	1	0		
18	18	1		14	0		0	30.0	1	0		
19	19	1		14	0		0	30.0	0	0		
20	20	1		0	0		0	94.0	0	0		
21		0		0	0		0	94.0	0	0		
22	22	0	:	20	21		0	68.5	0	0		
	23	0	:	20	21		1	1.0	0	0		
	24	0	:	20	21		1	1.0	0	0		
25		1	:	20	21		0	16.0	0	0		
26	26	0		0	24		0	30.0	0	0		
	27	1		0	24		0	30.0	0	0		
28	28	1		0	23		0	30.0	0	0		
	Age					_	AgeSl	kinLower	AgeSk			
1		30	HBI	1				1		30		
2		40	HBI	4				1		94		
3		36	HBI	4				1		36		
4		29	HBI	2				1		94		
5		50	HBI	2				1		50		
6		24	HBI	3				1		24		
7		23	HBI	3	C	23		1		23		
$\sim$		00	TIDT	_	_					~ ~		

HBI

HBI

HBI

11	63	HBI	7	0	63	1	63
12	92	HBI	7	0	92	1	92
13	64	HBI	8	0	64	1	64
14	74	HBI	8	0	74	1	74
15	NA	HBI	0	0	NA	1	94
16	NA	HBI	0	0	NA	1	94
17	NA	HBI	0	0	NA	1	94
18	NA	HBI	0	0	NA	1	94
19	NA	HBI	0	0	NA	1	94
20	99	HBI	5	0	94	1	94
21	100	HBI	5	0	94	1	94
22	NA	HBI	6	0	NA	1	94
23	NA	HBI	6	0	NA	1	94
24	NA	HBI	6	0	NA	1	94
25	16	HBI	6	0	16	1	16
26	NA	HBI	0	0	NA	1	94
27	NA	HBI	0	0	NA	1	94
28	NA	HBI	0	0	NA	1	94

Slot "posterior":

P160 P161 P162

[1,] 0.8795361 0.1204616 2.293133e-06

Slot "probs":

Pr(Being a carrier)

0.1204639

Slot "predictions":

By age Melanoma Risk 0.01116896 1 35 2 40 0.02295988 3 45 0.03501317 4 50 0.04710430 5 55 0.05901270 6 0.07047355 60 7 65 0.08147133 8 70 0.09176121 9 75 0.10088929 10 80 0.10850911 11 85 0.11429754

Slot "counselee.id":

[1] 1

Slot "loglik":

#### NULL

## Slot "future.risk": hFX0 hFX1 0.000000000 0.00000000 0.000000000 0.00000000 0.000000000 0.00000000 0.000000000 0.00000000 0.000000000 0.00000000 0.000000000 0.00000000 0.000000000 0.00000000 0.0000000000 0.00000000 0.000000000 0.00000000 10 0.000000000 0.00000000 11 0.000000000 0.00000000 12 0.000000000 0.00000000 13 0.000000000 0.00000000 14 0.000000000 0.00000000 15 0.000000000 0.00000000 16 0.000000000 0.00000000 17 0.000000000 0.00000000 18 0.000000000 0.00000000 19 0.000000000 0.00000000 20 0.0000000000 0.00000000 21 0.000000000 0.00000000 22 0.000000000 0.00000000 23 0.000000000 0.00000000 24 0.000000000 0.00000000 25 0.0000000000 0.00000000 26 0.0000000000 0.00000000 27 0.000000000 0.00000000 28 0.000000000 0.00000000 29 0.000000000 0.00000000 30 0.000000000 0.00000000 31 0.0001666687 0.01668756 32 0.0003465995 0.03365895 33 0.0005348096 0.05087558 34 0.0007304603 0.06830090 35 0.0009335321 0.08590033 36 0.0011440044 0.10364104 37 0.0013622627 0.12149190 38 0.0015907353 0.13942299 39 0.0018297821 0.15740585

40 0.0020793720 0.17541350 41 0.0023394615 0.19342038

- 42 0.0026107151 0.21140212
- 43 0.0028973655 0.22933472
- 44 0.0032000438 0.24719531
- 45 0.0035186513 0.26496227
- 46 0.0038530725 0.28261523
- 47 0.0042040053 0.30013479
- 48 0.0045761129 0.31750149
- 49 0.0049700017 0.33469687
- 50 0.0053854584 0.35170363
- 51 0.0058222547 0.36850563
- 52 0.0062793688 0.38508771
- 53 0.0067518608 0.40143493
- 54 0.0072386931 0.41753332
- 55 0.0077395899 0.43337006
- 56 0.0082542535 0.44893343
- 57 0.0087838650 0.46421261
- 58 0.0093368899 0.47919677
- 50 0 0000440044 0 40007400
- 59 0.0099142944 0.49387600
- 60 0.0105155306 0.50824151
- 61 0.0111400438 0.52228559
- 62 0.0117873526 0.53600111
- 63 0.0124575000 0.54937938
- 64 0.0131497805 0.56241250
- 65 0.0138633045 0.57509382
- 66 0.0145971564 0.58741788
- 67 0.0153486300 0.59937953
- 68 0.0161063139 0.61096990
- 69 0.0168673629 0.62218096
- 70 0.0176306408 0.63300638
- 71 0.0183950116 0.64344154
- 72 0.0191588188 0.65348229
- 73 0.0199178428 0.66311993
- 74 0.0206700202 0.67234715
- 75 0.0214137840 0.68115915
- 70 0.0211107040 0.00110010
- 76 0.0221476307 0.68955356
- 77 0.0228693099 0.69752853
- 78 0.0235726352 0.70507457
- 79 0.0242548677 0.71218469
- 80 0.0249141455 0.71885613
- 81 0.0255488666 0.72509006
- 82 0.0261580732 0.73088893
- 83 0.0267425968 0.73624571
- 84 0.0273001065 0.74115824
- 85 0.0278281805 0.74563124

>

#### 2.5.2 Germline and Marker Testing

Information about germline testing results is included in the germline.testing object. If the results of germline testing are available, the user can input them into a data frame with n rows and 2 columns with column name "P16" which stores the mutation testing results for P16 (0=no test, 1=positive test, 2=negative test).

```
> # The counselee's sister was tested for
> # germline mutations in P16, and one was found.
> # Proband was also tested, but no mutation was found.
> P16 <- rep(0, nrow(mela.fam))
> germline.testing = data.frame(P16)
> germline.testing[4,] <- 1</pre>
> germline.testing[1,] <- 2</pre>
> out <- melapro(family=mela.fam, germline.testing = germline.testing)
[1] "Warning: individuals have an unknown age of diagnosis. The calculation would be improve
The probability of being a carrier is 0
The risk of developing cancer is
   By age Melanoma Risk
1
       35 0.0009335321
2
       40 0.0020793720
3
       45 0.0035186513
4
       50 0.0053854584
5
       55 0.0077395899
6
       60 0.0105155306
7
       65 0.0138633045
8
       70 0.0176306408
9
       75 0.0214137840
10
       80 0.0249141455
11
       85 0.0278281805
```

>

## 2.6 BRCAPANCpro

#### 2.6.1 Family History

Before running your pedigree through brcapancpro, be sure it is structured as a numeric data frame with history of breast, ovarian, and pancreatic cancers: n rows (where n is the number

of family members, including the counselee) and 13 columns with column names:

Content

Column Name	Content
ID	Member identifier
Gender	Gender (0=female, 1=male)
FatherID	Father's identifier number
MotherID	Mother's identifier number
AffectedBreast	Breast cancer status (0=no cancer,
	1=breast cancer, one breast involved; 2=bilateral breast cancer, NA=unknown status)
AffectedOvary	Ovarian cancer status (0=no cancer, 1=ovarian cancer, NA=unknown status)
AffectedPancreas	Pancreatic cancer status (0=no cancer, 1=pancreatic cancer, NA=unknown status)
AgeBreast	Age of onset of breast cancer if a breast cancer case.
	Current age or age of death if not a breast cancer case.
	NA if there is no age information.
AgeOvary	Age of onset of ovarian cancer if an ovarian cancer case.
	Current age or age of death if not an ovarian cancer case.
	NA if there is no age information.
AgePancreas	Age of onset of pancreatic cancer if a pancreatic cancer case.
	Current age or age of death if not a pancreatic cancer case.
	NA if there is no age information.
${\bf Age Breast Contralateral}$	Age at onset of breast cancer, second breast.
	Only for members with breast cancer status=2. For the rest enter a 0.
Twins	Identifies siblings who are identical twins.
	Each twin pair is identified by a unique number. For the rest enter a 0.
ethnic	Identifies the ethnicity of each family member.
	Enter "nonAJ", "AJ", "Italian", "Other" or NA (as recognized by is.na() function).
Death	Vital Status (0=Alive, 1=Dead)
AgeDeath	Family member's age at death or current age if alive.

The parameters used by the model, including penetrance, allele frequency, and sensitivity/specificity of testing, are set using the function brcapancparams. Any changes to the parameters can be made by calling this function.

- > # Change future risk to be calculated in intervals of 2 y instead of the default of 5 y.
- > # Leave all other parameters as set.
- > myparams <- brcapancparams(age.by=2)</pre>
- > # Run BRCAPRO with family history information for example family
- > data(brcapanc.fam)

Column Name

- > out = brcapancpro(family=brcapanc.fam)
- [1] "Warning: age(s) older than age.max has been converted to age.max! Warning: age(s) older The probability of being a carrier is 0.5172612

BRCA1 carrier is 0.1827323 BRCA2 carrier is 0.214929

PANC carrier 0.03227949

The risks of developing cancers are

By age Breast Ca Risk Ovarian Ca Risk Pancreas Ca Risk 62 0.06907509 0.04100611 0.006524576

2	67	0.12817206	0.08770403	0.015927756
3	72	0.17788158	0.13683371	0.028097043
4	77	0.22573537	0.18555318	0.042415932
5	82	0.27130488	0.23122898	0.058200550

## > slotNames(out)

"predictions"

### > out@probs

Pr(Being a carrier) Pr(BRCA1 mutation) Pr(BRCA2 mutation) 0.5172612 0.1827323 0.214929 Pr(PANC mutation) Pr(BRCA1 and PANC mutation) 0.03227949 0.01189045 Pr(BRCA1 and BRCA2 mutation) Pr(BRCA2 and PANC mutation) 0.05739731 0.01415459 Pr(All three genes mutated) 0.003878078

### > out@family

	ID	Gender	FatherID	${\tt MotherID}$	${\tt AffectedBreast}$	AffectedOvary
1	1	0	3	2	0	0
2	2	0	9	8	0	1
3	3	1	11	10	0	0
4	4	0	0	1	0	0
5	5	1	3	2	0	0
6	6	0	0	0	0	0
7	7	0	3	2	1	0
8	8	0	0	0	0	1
9	9	1	0	0	0	0
10	10	0	0	0	0	0
11	11	1	0	0	0	0
12	12	0	9	8	0	0
13	13	0	9	8	0	0
14	14	0	11	10	1	0
15	15	1	5	6	0	0
16	16	1	0	7	0	0
17	17	0	0	7	0	0
18	18	0	0	7	0	0

19	19 0	0		7		(	)		0
20	20 0	21	1	12		(	)		0
21	21 1	0		0		(	)		0
22	22 0	9		8		2	2		0
23	23 0	0	2	22		(	)		0
24	24 1	5		6		(	)		0
25	25 1	5		6		(	)		0
	${\tt AgeBreast}$	AgeOvary	AgeBrea	ast(	Contralat	eral	Twins	ethnic	Death
1	57	57				0	0	nonAJ	0
2	70	69				0	1	nonAJ	0
3	87	87				0	0	nonAJ	0
4	32	32				0	0	nonAJ	0
5	50	50				0	0	nonAJ	0
6	57	57				0	0	nonAJ	0
7	45	47				0	0	nonAJ	0
8	65	65				0	0	nonAJ	0
9	94	94				0	0	nonAJ	0
10	75	75				0	0	nonAJ	0
11	94	94				0	0	nonAJ	0
12	85	85				0	0	nonAJ	0
13	79	79				0	0	nonAJ	0
14	1	70				0	0	nonAJ	0
15	23	23				0	0	nonAJ	0
16	12	12				0	0	nonAJ	0
17	22	22				0	0	nonAJ	0
18	19	19				0	0	nonAJ	0
19	16	16				0	0	nonAJ	0
20	54	54				0	0	nonAJ	0
21	77	77				0	0	nonAJ	0
22	40	70				45	1	nonAJ	0
23	40	40				0	0	nonAJ	0
24	17	17				0	2	nonAJ	0
25	17	17				0	2	nonAJ	0
	AgeDeath A	AffectedPa	ancreas	Age	ePancreas	Rela	ation 1	Mastecto	omy
1	57		0		57		1		0
2	70		0		70		4		0
3	87		1		60		4		0
4	32		0		32		3		0
5	50		0		50		2		0
6	NA		0		57		15		0
7	47		0		47		2		0
8	65		0		65		7		0
9	96		0		94		7		0
10	75		0		75		5		0
11	94		0		94		5		0

12		85			0	85		8		0	
13		79			0	79		8		0	
14		NA				70		6		0	
15		23				23		13		0	
16		12			0	12		13		0	
17		22			0		22 13				
18		19			0	19		13		0	
19		16			0	16		13		0	
20		54			0	54		0		0	
21		77				77					
					0			0		0	
22		70			0	70		8		0	
23		40			0	40		0		0	
24		17			0	17		13		0	
25		17			0	17		13		0	
	AgeMa	astect		lophorect		AgeOophore					
1			1		0		1	0	0	0	0
2			1		0		1	0	0	0	0
3			1		0		1	0	0	0	0
4			1		0		1	0	0	0	0
5			1		0		1	0	0	0	0
6			1		0		1	0	0	0	0
7			1		0		1	0	0	0	0
8			1		0		1	0	0	0	0
9			1		0		1	0	0	0	0
10			1		0		1	0	0	0	0
11			1		0		1	0	0	0	0
12			1		0		1	0	0	0	0
13			1		0		1	0	0	0	0
14			1		0		1	0	0	0	0
15			1		0		1	0	0	0	0
16			1		0		1	0	0	0	0
17			1		0		1		0	0	
								0			0
18			1		0		1	0	0	0	0
19			1		0		1	0	0	0	0
20			1		0		1	0	0	0	0
21			1		0		1	0	0	0	0
22			1		0		1	0	0	0	0
23			1		0		1	0	0	0	0
24			1		0		1	0	0	0	0
25			1		0		1	0	0	0	0
	CK14	CK5.6	HER2	AgeCur	Age	BreastLower	AgeBr	reastUj	pper		
1	0	0	C	57		1			57		
2	0	0	C	70		1			70		
3	0	0	C	87		1			87		
4	0	0	C	32		1			32		

5	0	0	0	50	1	50
6	0	0	0	NA	1	94
7	0	0	0	47	1	47
8	0	0	0	65	1	65
9	0	0	0	94	1	94
10	0	0	0	75	1	75
11	0	0	0	94	1	94
12	0	0	0	85	1	85
13	0	0	0	79	1	79
14	0	0	0	NA	1	94
15	0	0	0	23	1	23
16	0	0	0	12	1	12
17	0	0	0	22	1	22
18	0	0	0	19	1	19
19	0	0	0	16	1	16
20	0	0	0	54	1	54
21	0	0	0	77	1	77
22	0	0	0	70	1	70
23	0	0	0	40	1	40
24	0	0	0	17	1	17
25	0	0	0	17	1	17
	AgeOvar	yLower	Age	eOvaryUpper	AgeBreastContra	lateralLower
1		1		57		1
2		1		70		1
3		1		87		1
4		1		32		1
5		1		50		1
6		1		94		1
7		1		47		1
8		1		65		1
9		1		94		1
10		1		75		1
11		1		94		1
12		1		85		1
13		1		79		1
14		1		94		1
15		1		23		1
16		1		12		1
17		1		22		1
18		1		19		1
19		1		16		1
20		1		54		1
21		1		77		1
<ul><li>21</li><li>22</li><li>23</li></ul>		1 1 1		77 70 40		1 1

24		1	17		1
25		1	17		1
	AgeBreastCor	ntralateralUp	_	AgePancreasLower	
1			57	1	57
2			70	1	70
3			87	1	87
4			32	1	32
5			50	1	50
6			94	1	94
7			47	1	47
8 9			65 94	1	65 94
10			94 75	1	75
11			94	1	94
12			85	1	85
13			79	1	79
14			94	1	94
15			23	1	23
16			12	1	12
17			22	1	22
18			19	1	19
19			16	1	16
20			54	1	54
21			77	1	77
22			70	1	70
23			40	1	40
24			17	1	17
25			17	1	17
	uua2 uua3				
1	FALSE FALSE				
2	FALSE FALSE				
3	FALSE FALSE				
4	FALSE FALSE				
	FALSE FALSE				
	TRUE TRUE				
	FALSE FALSE				
	FALSE FALSE				
	FALSE FALSE FALSE				
	FALSE FALSE				
	FALSE FALSE				
	FALSE FALSE				
	TRUE TRUE				
	FALSE FALSE				
	FALSE FALSE				
	~ 111011				

```
17 FALSE FALSE
18 FALSE FALSE
19 FALSE FALSE
20 FALSE FALSE
21 FALSE FALSE
22 FALSE FALSE
23 FALSE FALSE
24 FALSE FALSE
25 FALSE FALSE
```

>

Note that brcapancpro does not include the option for net/crude future risk. All the optional inputs for brcapro and pancpro such as germline testing results, marker testing results, race, ethnicity, mastectomies, and oophorectomies can be used for brcapancpro.

## 2.7 brcaproPlusBCRAT

brcaproPlusBCRAT is a model that combines brcapro and BCRAT (Gail, Mitchell H., et al. "Projecting individualized probabilities of developing breast cancer for white females who are being examined annually." JNCI: Journal of the National Cancer Institute 81.24 (1989): 1879-1886.). BCRAT is available through the BCRA R package on CRAN. bcraproPlusBCRAT uses BCRAT relative risks to modify the brcapro penetrances. Users can also run brcaproPlusB-CRAT using brcapro, with the option plusBCRAT = TRUE.

Users can directly provide the relative risks through the option rr.bcrat, which is a vector of length 2 denoting the proband's BCRAT relative risk before 50 and the proband's BCRAT relative risk after 50. Alternatively, the user can provide input data for the BCRAT model using the option bcrat.vars, which can then be used as an input for the relative.risk function in the BCRA package.

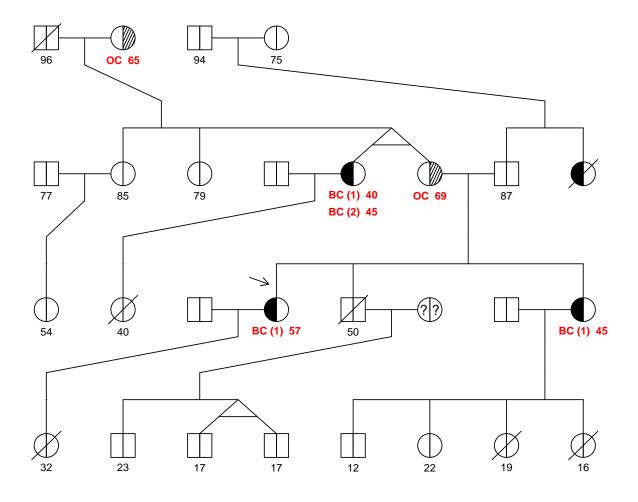
## 2.8 LFSpro

LFSpro is a Mendelian model that estimates the probability of carrying a TP53 mutation, which is the main cause of Li-Fraumeni Syndrome (Peng, Gang, et al. "Estimating TP53 mutation carrier probability in families with Li-Fraumeni syndrome using LFSPRO." Cancer Epidemiology and Prevention Biomarkers 26.6 (2017): 837-844.). For more details about running the package, see https://bioinformatics.mdanderson.org/public-software/lfspro/.

## 3 Other Features

## 3.1 Plotting a pedigree

The family history data frame can be displayed graphically in a traditional pedigree plot. There are two options for plotting your pedigree. If you want to plot your pedigree without running it through any of the models, the family history data frame family must be set to be part of the BayesMendel class and then plotted by simply using the generic function plot. If the vital status of family members is known, it can included by adding a column labeled "status" can be added to the family data frame. Enter 0 if the individual is alive, or 1 if not alive.



The pedigree can also be run through any of the models and plotted with the carrier probabilities displayed on the graph.

- > pdf("mmrfamplot.pdf")
- > MMR.fam\$Death <- rbinom(nrow(MMR.fam), 1, 0.2)</pre>
- > mmrpro.out <- MMRpro(family=MMR.fam, counselee.id=1)</pre>
- [1] "Warning: individuals have an unknown age of diagnosis. The calculation would be improve The probability of being a carrier is 0.1751956
- an MLH1 carrier 0.07663265
- an MSH2 carrier 0.09514061

### an MSH6 carrier 0.003518854

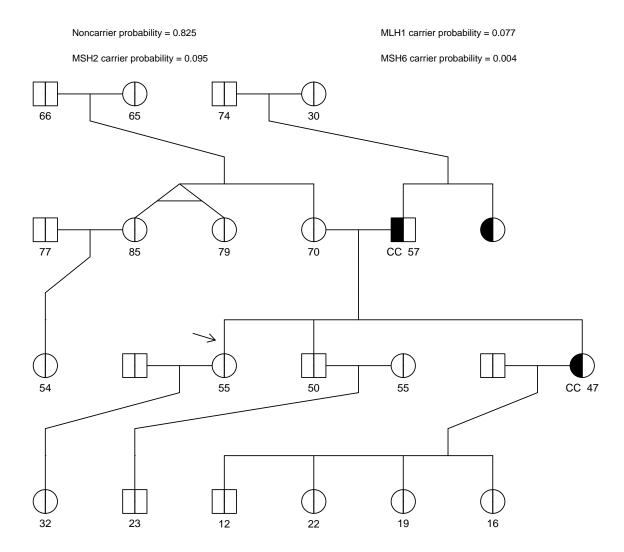
The risks of developing cancers are  $% \left\{ 1,2,...,n\right\}$ 

The risks of developing cancers are					
	By age	Colorectal Ca Risk	Endometrial Ca Risk		
1	60	0.01386688	0.03081084		
2	65	0.02814948	0.05156948		
3	70	0.04264259	0.05918417		
4	75	0.05675906	0.06269512		
5	80	0.06997522	0.06520771		
6	85	0.08106401	0.06685401		

<sup>&</sup>gt; plot(mmrpro.out, cex=0.2)

null device

<sup>&</sup>gt; dev.off()



# 4 Interpreting the Risk Predictions

The BayesMendel models can predict both net and crude future risk. Let  $T_C$  be the theoretical (discrete, in years) age of the specific cancer of interest of the proband. Thus, in the hypothetical scenario where the proband does not die before this age, the proband would develop the cancer of interest at this age. It is important to note that the proband may or may not actually observe this outcome. Now let  $T_D$  be the age of death from causes other than the cancer for the proband, and let  $T = \min(T_C, T_D)$  be the age of the first outcome, either the cancer of interest or death from other causes. Let J = C if  $T = T_C$ ; i.e., if the proband actually

develops the cancer of interest, and let J = D if  $T = T_D$ .

Net t-year risk predictions in these models can be interepreted as the probability of developing the disease within t years, conditional on being disease-free at the current age, assuming no death from other causes. Thus the t-year net risk, given that the proband is currently age  $t_0$ , is

$$P(T_C \le t_0 + t | T_C > t_0).$$

Crude t-year risk is the probability of developing the disease within t years (without death from other causes), conditional on being disease-free and alive at the current age. Thus the t-year crude risk is

$$P(T \le t_0 + t, J = C|T > t_0).$$

Here we ignore the dependency on the gender and genotype in the penetrance functions.

## 5 Further Information

More information about our methods and software can be found at our website https://projects.iq.harvard.edu/bayesmendel. We can also be reached by email at BayesMendel@jimmy.harvard.edu.