# Beta-binomial

#### Parametrisation

The Beta-binomial distribution arise from a hierarchical model where the probability p is Beta-distributed<sup>1</sup>

$$\pi(p) = \frac{1}{B(\alpha, \beta)} p^{\alpha - 1} (1 - p)^{\beta - 1}, \quad \alpha > 0, \ \beta > 0$$

and the response y is Binomial

$$\pi(y \mid p) = \binom{n}{y} p^y (1-p)^{(n-y)}, \quad y = 0, 1, \dots, n.$$

The marginal distribution for y is the Beta-binomial,

$$\pi(y) = \binom{n}{y} \frac{B(y+\alpha, n-y+\beta)}{B(\alpha, \beta)}.$$

### Link-function

The mean and variance of y are given as

$$\mu = n \frac{\alpha}{\alpha + \beta} = n \mu_p$$
, and  $\sigma^2 = n \mu_p (1 - \mu_p) (1 + (n - 1)\rho)$ ,

where  $\mu_p = \frac{\alpha}{\alpha + \beta}$  is the mean of the probability p from the Beta-distribution, and  $\rho = \frac{1}{\alpha + \beta + 1}$  (0 <  $\rho$  < 1) is the pairwise correlation between the n Bernoulli draws and is the over-dispersion parameter.

The mean probability  $\mu_p$  is linked to the linear predictor by

$$\mu_p = \frac{\exp(\eta)}{1 + \exp(\eta)}$$

using the default logit-link.

## Hyperparameter

The hyperparameter is the over-dispersion parameter  $\rho$ , which is represented as

$$\rho = \frac{\exp(\theta)}{1 + \exp(\theta)}$$

and the prior is defined on  $\theta$ .

#### Specification

- family="betabinomial"
- Required arguments: y and Ntrials = n (default Ntrials = 1).

<sup>&</sup>lt;sup>1</sup>The Beta-function is  $B(\alpha, \beta) = \frac{\Gamma(\alpha)\Gamma(\beta)}{\Gamma(\alpha+\beta)}$ , where  $\Gamma(x)$  is the Gamma-function.

```
Hyperparameter spesification and default values
```

```
\operatorname{\mathbf{doc}} The Beta-Binomial likelihood
hyper
     theta
         hyperid 62001
         name overdispersion
         short.name rho
         output.name overdispersion for the betabinomial observations
         output.name.intern intern overdispersion for the betabinomial observations
         initial 0
         fixed FALSE
         prior gaussian
         param 0 0.4
         to.theta function(x) log(x / (1 - x))
         from.theta function(x) exp(x) / (1 + exp(x))
survival FALSE
discrete TRUE
link default logit loga cauchit probit cloglog ccloglog loglog robit sn
pdf betabinomial
Example
In the following example we estimate the parameters in a simulated example.
## overdispersion parameter in the betabinomial
rho = 0.7
n = 1000
z = rnorm(n, sd=0.2)
Ntrials = sample(1:10, n, replace=TRUE)
eta = 1 + z
p.eta = exp(eta)/(1+exp(eta))
a = p.eta * (1-rho)/rho
b = (p.eta * rho - p.eta - rho + 1)/rho
p = rbeta(n, a, b)
y = rbinom(n, Ntrials, p)
formula = y \sim 1 + z
data = data.frame(y, z)
r = inla(formula, data = data,
        family = "betabinomial", Ntrials=Ntrials)
summary(r)
```

## Notes

None.