# The Berkson Measurement Error (MEB) model

#### Parametrization

This is an implementation of the Berksom measurement error model for a fixed effect. The observed covariate is w but it is x that goes into the linear predictor

$$\eta = \ldots + \beta x + \ldots$$

where x = w + u. The error term u is Gaussian with prior  $\mathcal{N}(0, \tau_u \mathbf{D})^1$ , where  $\tau_u$  is the observational precision of the error  $\operatorname{Prec}(u|x)$ ) with possible heteroscedasticy, encoded in the entries  $d_i$  of the diagonal matrix  $\mathbf{D}$ . The vector s contains the fixed scalings  $s = (d_1, \ldots, d_n)$  (with n the number of data points).

## Hyperparameters

This model has 2 hyperparameters,  $\theta = (\theta_1, \theta_2)$ . The hyperparameter specification is as follows:

$$\theta_1 = \beta$$

and the prior is defined on  $\theta_1$ ,

$$\theta_2 = \log(\tau_u)$$

and the prior is defined on  $\theta_2$ .

#### Specification

The MEB is specified inside the f() function as

```
f(w, [<weights>,] model="meb", scale = <s>, values= <w>, hyper = <hyper>)
```

Here, w are the observed covariates, and the fixed scaling of the observational precision is given in argument scale. If the argument scale is not given, then s is set to 1.

Note that only the unique values of w are used, so if two or more elements of w are *identical*, then they refer to the *same* element in the covariate x. If data points with identical w values belong to different x values (e.g., different individuals), please add a *tiny* random value to w to make this difference obvious to the model.

#### Hyperparameter specification and default values

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## hyper

## theta1

hyperid 3001 name beta short.name b prior gaussian param 1 0.001 initial 1 fixed FALSE to.theta function(x) x

<sup>&</sup>lt;sup>1</sup>Note: The second argument in  $\mathcal{N}(,)$  is the precision not the variance.

```
from.theta function(x) x
    theta2
         hyperid 3002
         name prec.u
         short.name prec
         prior loggamma
         param 1 1e-04
         initial 6.90775527898214
         fixed FALSE
         to.theta function(x) log(x)
         from.theta function(x) exp(x)
constr FALSE
nrow.ncol FALSE
augmented FALSE
aug.factor 1
aug.constr
n.div.by
n.required FALSE
set.default.values FALSE
status experimental
pdf meb
Example
n = 100
beta = 2
w = rnorm(n)
prec.u = 1
prec.y = 1
## heteroscedastic scaling
s = runif(n,min=0,max=1)
## true but unobserved covariate
x = w + rnorm(n, sd = 1/sqrt(s*prec.u))
y = 1 + beta*x + rnorm(n, sd = 1/sqrt(prec.y))
## prior parameters
prior.beta = c(0, 0.0001)
prior.prec.u = c(10, 9/prec.u)
prior.prec.y = c(10, 9/prec.y)
formula = y ~ f(w, model="meb", scale=s, values=w,
    hyper = list(
```

```
beta = list(
            prior = "gaussian",
            param = prior.beta,
            fixed = FALSE
        ),
        prec.u = list(
            prior = "loggamma",
            param = prior.prec.u,
            initial = log(prec.u),
            fixed = FALSE
        )
    )
)
r = inla(formula, data = data.frame(y, w, s),
    family = "gaussian",
    control.family = list(
        hyper = list(
            prec = list(param = prior.prec.y,
                fixed = FALSE
            )
        )
    )
)
```

## Notes

- INLA provides the posteriors of  $\nu_i = \beta x_i$  and NOT  $x_i$ .
- The posteriors of  $\nu_i$  come (default) in the order given by the sorted (from low to high) values of w. The entry \$ID gives the mapping.
- The option scale defines the scaling in the same order as argument values. It is therefore adviced to also give argument values when scale is used to be sure that they are consistent.