

# BDA - Assignment 2

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```
library(markmyassignment)
exercise_path = 'https://github.com/avehtari/BDA_course_Aalto/blob/master/exercises/tests/ex2.yml'
set_assignment(exercise_path)
```

```
## Assignment set:
## ex2: Bayesian Data Analysis: Assignment 2
## The assignment contain the following (3) tasks:
## - beta_point_est
## - beta_interval
## - beta_low
```

```
library(aaltobda)
data('algae')
head(algae)
```

```
## [1] 0 1 1 0 0 0
```

```
algae_test = c(0,1,1,0,0,0)
```

## Exercise 1 a

- Likelihood:

$$\Rightarrow p(y \mid \pi) = \pi^y * (1 - \pi)^{(n-y)}$$

$$\Rightarrow p(44 \mid \pi) = \pi^{44} * (1 - \pi)^{(274-44)}$$

$$\Rightarrow p(44 \mid \pi) = \pi^{44} * (1 - \pi)^{(230)}$$

- Prior:

$\Rightarrow \text{Beta}(\pi | \alpha, \beta) \pi^{\alpha-1} (1-\pi)^{\beta-1}$

$\Rightarrow \text{Beta}(\pi | 2, 10) \pi^{2-1} (1-\pi)^{10-1}$

$\Rightarrow \text{Beta}(\pi | 2, 10) \pi^1 (1-\pi)^9$

- Posterior:

$\Rightarrow \text{Beta}(\pi | \alpha + y, \beta + n - y)$

$\Rightarrow \text{Beta}(\pi | 2 + 44, 10 + 274 - 44)$

$\Rightarrow \text{Beta}(\pi | 46, 240)$

```
beta_point_est = function(prior_alpha, prior_beta, data) {
  y = sum(data)
  n.minus.y = sum(data < 1)
  cat('y is',y, 'and n minus y is', n.minus.y, '\n')

  mean = sum(prior_alpha, y) / sum(prior_alpha, y, prior_beta, n.minus.y)
  cat('The point estimate with Beta(2,10) prior is:', mean, '\n')
}

beta_point_est(2, 10, algae)
```

```
## y is 44 and n minus y is 230
## The point estimate with Beta(2,10) prior is: 0.1608392
```

```
beta_interval = function(prior_alpha, prior_beta, data, prob_interval) {
  y = sum(data)
  n.minus.y = sum(data < 1)

  an = sum(prior_alpha, y)
  bn = sum(prior_beta, n.minus.y)

  lower_q = qbeta(0.05, an, bn)
  upper_q = qbeta(0.95, an, bn)

  cat('The 90% interval estimate with Beta(2,10) prior is [', lower_q,',', upper_q, ']')
}

beta_interval(2, 10, algae, 0.9)
```

```
## The 90% interval estimate with Beta(2,10) prior is [ 0.1265607 , 0.1978177 ]
```

## Exercise 1 b

```

beta_low = function(prior_alpha, prior_beta, data, pi_0){
  y = sum(data)
  n.minus.y = sum(data < 1)

  an = sum(prior_alpha, y)
  bn = sum(prior_beta, n.minus.y)

  prob = pbeta(pi_0, an, bn)
  cat('The probability that the proportion of monitoring sites with\n detectable algae levels',
      'pi is smaller than pi = 0.2 with Beta(2,10) prior is:', prob,'\n',
      '(',prob*100,'%')')
}

beta_low(2, 10, algae, 0.2)

```

```

## The probability that the proportion of monitoring sites with
## detectable algae levels pi is smaller than pi = 0.2 with Beta(2,10) prior is: 0.9586136
## ( 95.86136 %)

```

## Exercise 1 c

### Assumptions

- We assume that the level of algae has exactly two outcomes: '0': no algae and '1': algae present (exchangeability)
- We assume that the algae levels  $n$  are conditionally independent given  $\theta$ , with the probability of algae present equal to  $\theta$  for all cases
- We assume  $\theta$  to have prior uniform distribution  $[0,1]$

## Exercise 1 d

```

beta_sensitivity = function(prior_alpha, prior_beta, data, prob_interval) {

  cat('This is a function for building a sensitivity table')
  cat('\n')
  cat('#####')
  cat('\n')
  prior = prior_alpha / sum(prior_alpha, prior_beta)
  prior2 = prior_alpha + prior_beta
  cat('Prior alpha / (alpha + beta):',prior)
  cat('\n')
  cat('Prior alpha + beta:', prior2)
  cat('\n')

  y = sum(data)
  n.minus.y = sum(data < 1)
  point_est = sum(prior_alpha, y) / sum(prior_alpha,y, prior_beta, n.minus.y)
  cat('The point estimate:', point_est, '\n')
}

```

```

an = sum(prior_alpha, y)
bn = sum(prior_beta, n.minus.y)
lower_q = qbeta(0.05, an, bn)
upper_q = qbeta(0.95, an, bn)
cat('The 90% interval estimate: [', lower_q,',', upper_q, '] \n')
cat('##### \n')
}

beta_sensitivity(16.666667, 83.333333, algae, 0.9)

## This is a function for building a sensitivity table
## #####
## Prior alpha / (alpha + beta): 0.1666667
## Prior alpha + beta: 100
## The point estimate: 0.1622103
## The 90% interval estimate: [ 0.1319532 , 0.1945234 ]
## #####

library(knitr)
library(kableExtra)

df = matrix(c(0.5, 2, 0.375, '[ 0.1287564 , 0.6587386 ]',
              0.1666667, 5, 0.160693, '[ 0.1260208 , 0.1981342 ]',
              0.1666667, 10, 0.1607981, '[ 0.1264086 , 0.1979071 ]',
              0.1666667, 20, 0.1609977, '[ 0.1271531 , 0.1974676 ]',
              0.1666667, 100, 0.1622103, '[ 0.1319532 , 0.1945234 ]',
              0.1666667, 200, 0.1631505, '[ 0.1360914 , 0.1918269 ]'), ncol = 4, byrow = TRUE)
colnames(df) = c('alpha / alpha + beta', 'alpha + beta', 'Posterior median of theta',
                 '90% posterior interval for theta')
df = as.table(df)

kable(df, 'latex', booktabs = T, caption = 'Sensitivity analysis', linesep = "") %>%
  kable_styling(latex_options = c('striped', 'hold_position', 'scale_down')) %>%
  column_spec(2:5, bold = T)

```

Table 1: Sensitivity analysis

	alpha / alpha + beta	alpha + beta	Posterior median of theta	90% posterior interval for theta
A	0.5	2	0.375	[ 0.1287564 , 0.6587386 ]
B	0.1666667	5	0.160693	[ 0.1260208 , 0.1981342 ]
C	0.1666667	10	0.1607981	[ 0.1264086 , 0.1979071 ]
D	0.1666667	20	0.1609977	[ 0.1271531 , 0.1974676 ]
E	0.1666667	100	0.1622103	[ 0.1319532 , 0.1945234 ]
F	0.1666667	200	0.1631505	[ 0.1360914 , 0.1918269 ]

```

cat('Table 1 shows that posterior inferences are not sensitive to prior distribution.\n',
    'This means that the Bayesian analysis is robust to the change of prior.')

```

```

## Table 1 shows that posterior inferences are not sensitive to prior distribution.
## This means that the Bayesian analysis is robust to the change of prior.

```