# Notes on likelihood, p. 35–41

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## Notes on section 2.3.1, p. 35–36

### Create matrix

The transition probability matrix  $(\mathbf{t.p.b})$ ,  $\Gamma$ , must have its column summing to one (sum of probability of transition). The stationnary distrib  $\delta$  is such that:

$$\delta\Gamma = \delta 
\delta 1 = 1$$
(1)

where  $\mathbb{1} = (1, ..., 1)$ . The second equation basically says  $\sum_{i} \delta_{i} = 1!$ 

```
gammaMatrix = matrix(data = c(1/2, 1/2, 1/4, 3/4), nrow = 2, byrow = TRUE)

if (unique(rowSums(gammaMatrix)) != 1)
     warning("The sum of gamma's columns should be 1!")

## Stationnary distribution
delta = 1/3*c(1, 2)

# Check sum is one
sum(delta)

## [1] 1
```

```
t(delta) %*% gammaMatrix - t(delta)

## [,1] [,2]
## [1,] 0 0

t(gammaMatrix) %*% delta == delta
```

```
## [,1]
## [1,] TRUE
## [2,] TRUE
```

#### Get equation 2.11 and table 2.1

The law of total proba is enough to derive the equation (2.11), and then use equation (2.5) remembering that the parent of  $X_i$  is  $C_i$ , and that the parent of  $C_i$  is  $C_{i-1}$ :

$$\begin{split} \Pr(X_1 = 1, X_2 = 1, X_3 = 1) &= \sum_i \sum_j \sum_k \Pr(X_1 = 1, X_2 = 1, X_3 = 1, C_1 = i, C_2 = j, C_3 = k) \\ &= \sum_i \sum_j \sum_k \Pr(C_1 = i) \Pr(X_1 = 1 | C_1 = i) \times \\ &\qquad \qquad \Pr(C_2 = j | C_1 = i) \Pr(X_2 = 1 | C_2 = j) \times \\ &\qquad \qquad \Pr(X_3 = 1 | C_3 = k) \Pr(C_3 = k | C_2 = j) \\ &= \sum_i \sum_j \sum_k \delta_i p_i(1) \gamma_{ij} p_j(1) \gamma_{jk} p_k(1) \end{split}$$

In the following R code,  $Pr_X_C$  denotes the proba Pr(X = x | C = c). In this example, C has only two possible states: 1 and 2, and X is a bernoulli variable, *i.e.*, 0 or 1.

```
\# Pr_X_C = Pr(X = x | C = c)
Pr \ 0 \ 1 = 1/2
Pr_1_1 = 1/2
Pr_0_2 = 1
Pr_1_2 = 1
combinations = expand.grid(rep(list(1:2), 3))
setDT(combinations)
setnames(combinations, new = c("i", "j", "k"))
setorderv(combinations, cols = colnames(combinations), order=1L)
# List all the way to get X1 = 1, X2 = 1, and X3 = 1
combinations[i == 1, pi_1 := Pr_1_1]
combinations[i == 2, pi_1 := Pr_1_2]
combinations[j == 1, pj_1 := Pr_1_1]
combinations[j == 2, pj_1 := Pr_1_2]
combinations[k == 1, pk_1 := Pr_1_1]
combinations[k == 2, pk_1 := Pr_1_2]
combinations[i == 1, delta_i := 1/3]
combinations[i == 2, delta_i := 2/3]
combinations[(i == 1) & (j == 1), gamma_ij := gammaMatrix[1, 1]]
combinations[(i == 1) & (j == 2), gamma_ij := gammaMatrix[1, 2]]
combinations[(i == 2) & (j == 1), gamma_ij := gammaMatrix[2, 1]]
combinations[(i == 2) & (j == 2), gamma_ij := gammaMatrix[2, 2]]
combinations[(j == 1) & (k == 1), gamma_jk := gammaMatrix[1, 1]]
combinations[(j == 1) & (k == 2), gamma_jk := gammaMatrix[1, 2]]
combinations[(j == 2) & (k == 1), gamma_jk := gammaMatrix[2, 1]]
combinations[(j == 2) & (k == 2), gamma_jk := gammaMatrix[2, 2]]
combinations[, product := delta_i*pi_1 * gamma_ij*pj_1 * gamma_jk*pk_1]
```

Each row correspond to one combination of (i, j, k). The sum gives the probability  $Pr(X_1 = 1, X_2 = 1, X_3 = 1) = 29/48$