

# Multistate

Dr RW Rankin and KE Nicholson

Georgetown University, Murdoch University

October 29, 2017

CONGRATULATIONS!

... you have been doing multi-state models all along!

The CJS, POPAN, PCRD and just specific versions of a more general multistate model

The difference between the CJS, POPAN and PCRD formulations vs the more general Multistate model (of Brownie et al) is the number of events

## CJS/POPAN/PCRD

- ▶ Number of events: 2 (no-capture, capture)
- ▶ n.rows in Emission Matrix: 2 (no-capture, capture)

## Multistate

- ▶ Number of events: number of strata + no-capture
- ▶ n.rows in Emission Matrix: number of strata + no-capture

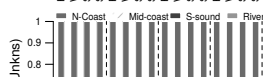
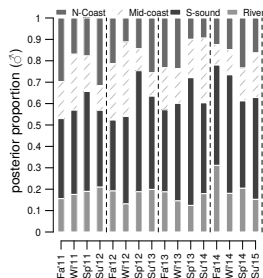
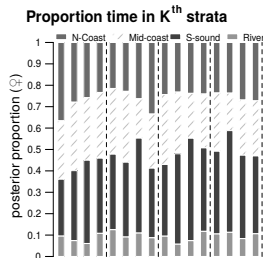
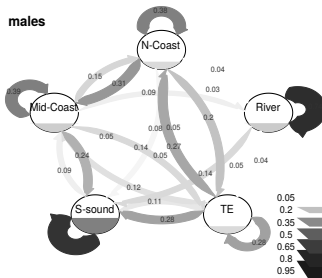
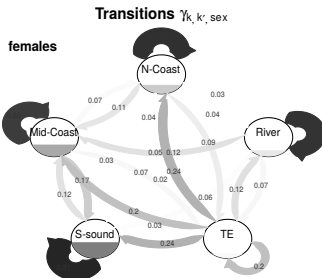
# Multistate Emission Matrix (Example)

$$\Psi_{s,t} = \begin{array}{l} \text{Capture A} \\ \text{Capture B} \\ \text{Capture C} \\ \text{No Capture} \end{array} \begin{array}{ccccc} \text{Strata A} & \text{Strata B} & \text{Strata C} & \text{TE} & \text{Dead} \\ \left( \begin{array}{ccccc} p_{s,t}^a & 0 & 0 & 0 & 0 \\ 0 & p_{s,t}^b & 0 & 0 & 0 \\ 0 & 0 & p_{s,t}^c & 0 & 0 \\ 1 - p_{s,t}^a & 1 - p_{s,t}^b & 1 - p_{s,t}^c & 1 & 1 \end{array} \right) \end{array}$$

Despite its generality, we generally refer to a “multistate model” (?) as one where there are **multiple observation strata**.

- ▶ i.e., more than 2 rows in Emission Matrix

# Example 1: Swan River Bottleneck (Rankin and Chabanne, unpub.)



## Example 1: Swan River Bottlenose: Transmission Matrix

$$\Phi = \begin{matrix} & \begin{matrix} \text{un-recruited} & \text{strata 1} & \dots & \text{strata 4} & \text{TE} & \text{dead} \end{matrix} \\ \begin{matrix} \text{un-recruited} \\ \text{strata 1} \\ \vdots \\ \text{strata 4} \\ \text{TE} \\ \text{dead} \end{matrix} & \left( \begin{array}{cccccc} 1 - \psi & 0 & \dots & 0 & 0 & 0 \\ \psi \lambda_1 & \phi \gamma_{1,1} & \dots & \phi \gamma_{4,1} & \phi \gamma_{\text{te},1} & 0 \\ \vdots & \vdots & \ddots & \vdots & \vdots & 0 \\ \psi \lambda_4 & \phi \gamma_{1,4} & \dots & \phi \gamma_{4,4} & \phi \gamma_{\text{te},4} & 0 \\ \psi \lambda_{\text{te}} & \phi \gamma_{1,\text{te}} & \dots & \phi \gamma_{4,\text{te}} & \phi \gamma_{\text{te},\text{te}} & 0 \\ 0 & 1 - \phi & \dots & 1 - \phi & 1 - \phi & 1 \end{array} \right) \end{matrix}$$

- $\gamma$  are strata-movement probabilities:  $\sum_{k=1}^K \gamma_{k,l} = 1$  (with a dirichlet prior)
- $\lambda$  are strata-assortment probabilities  $\sum_{k=1}^K \lambda_k = 1$  (with a dirichlet prior)

## Example 1: Swan River Bottlenose: Emission Matrix

$$\Psi = \begin{array}{l} \text{event 1} \\ \text{event 2} \\ \text{event 3} \\ \text{event 4} \\ \text{no-capture} \end{array} \begin{array}{c} \text{un-recruited} \quad \text{strata 1} \quad \text{strata 2} \quad \text{strata 3} \quad \text{strata 4} \quad \text{TE} \quad \text{dead} \\ \left( \begin{array}{cccccc} 0 & p_1 & 0 & 0 & 0 & 0 & 0 \\ 0 & 0 & p_2 & 0 & 0 & 0 & 0 \\ 0 & 0 & 0 & p_3 & 0 & 0 & 0 \\ 0 & 0 & 0 & 0 & p_4 & 0 & 0 \\ 1 & 1-p_1 & 1-p_2 & 1-p_3 & 1-p_4 & 1 & 1 \end{array} \right) \end{array}$$

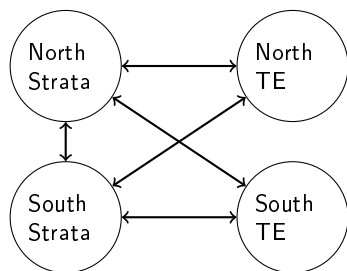


In JAGS syntax:

- ▶ how to code-up the Swan River bottlenose Transmission and Emission matrices?
- ▶ (open up a JAGS script and lets do it together)

- ▶ Humpback dolphins from Queensland, Australia
- ▶ Daniele Cagnazzi, unpublished (6 years, censored due to data restrictions)
- ▶ 2 states (north and south strata)
- ▶ 2 temporary emigration states (North TE, South TE)
- ▶ variable secondary periods
- ▶ unequal sampling areas (with correction factors)
- ▶ external Flooding covariate (effects on capture probability, muddy waters)
- ▶ two sexes

## Exercise 2



---

Time to open up jags!