# Estimation of Demographic Parameters for New Zealand Sea Lions Breeding on the Auckland Islands 

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## Survival and Reproduction

- 2 key demographic processes
- Can be estimated from tag-resight data using mark-recapture methods
- Previous report highlighted importance of accounting for tag-loss
- Artificially inflates mortality rates
- Sightability may be different for breeders/non-breeders, branded animals, number of flipper tags


## Survival and Reproduction

- 4 components to model tag-resight data
- Number of flipper tags each year
- Survival from one year to next
- Whether female breeds in a year
- Number of sightings in a year


## Survival and Reproduction

- Number of flipper tags in year $t$ is multinomial random variable with 1 draw and category probabilities ( $\pi$ 's) that depends on number of tags in previous year (allows for non-independent tag loss)

Number of tags in year $t$

|  |  | 0 | 1 | 2 |
| :---: | :---: | :---: | :---: | :---: |
| Number <br> of tags <br> in year <br> $t-1$ | 0 | 1 | 0 | 0 |
|  | 1 | $1-\pi_{1,1}$ | $\pi_{1,1}$ | 0 |
|  | 2 | $1-\pi_{1,2}-\pi_{2,2}$ | $\pi_{1,2}$ | $\pi_{2,2}$ |
|  |  |  |  |  |

## Survival and Reproduction

- Given female is alive, it's age and breeding status in year $t-1$, whether it is alive in year $t$ is a Bernoulli random variable where probability of success (survival) is $S_{\text {age,t-1,bred }}$


## Survival and Reproduction

- Given female is alive in year $t$, it's age and breeding status in year $t-1$, whether it breeds in year $t$ is a Bernoulli random variable where probability of success (breeding) is $B_{\text {age,t,bred }}$


## Survival and Reproduction

- 3 age-classes used for survival/reproduction: 0-3, 4-14, 15+
- OR, constant for 0-3, and logit-linear for age 4+
- Survival and breeding probabilities $=0$ for "breeders" in 0-3 age class


## Survival and Reproduction

$$
\begin{gathered}
y_{a, t, b}=\mu_{a, b}+\varepsilon_{t, b}, \quad \varepsilon_{t, b} \square N\left(0, \sigma_{b}^{2}\right) \\
\theta_{a, t, b}=\frac{e^{y_{a, t, b}}}{1+e^{y_{a, t, b}}}
\end{gathered}
$$

- Annual variation depends upon previous breeding status


## Survival and Reproduction

- Given female is alive, it's breeding status, presence of a brand, PIT tag and number of tags in year $t$, the number of times it's sighted during a field season is a zeroinflated binomial random variable with a daily resight probability $p_{t, \text { bred,brand,tags }}$
- 3 models: no inflation, time constant inflation, time varying inflation


## Survival and Reproduction

- Branded animals have the same resight probability regardless of number of flipper tags.
- Animals with no flipper tags can only be resighted if they are chipped or branded.
- PIT tags have no effect on the resight probability if the unbranded animal has 1 or more flipper tags.
- There is a consistent odds ratio ( $\delta$ ) between resighting animals with 1 and 2 flipper tags.
- Resight probabilities are different for breeding and nonbreeding animals.
- Resight probabilities vary annually.


## Survival and Reproduction

$p_{t, \text { bred,brand }}$ - applies to all females with brand
$p_{t, \text { bred,chip }}$ - applies to unbranded females with no flipper tags
$p_{t, \text { bred,T1 }} \quad$ - applies to unbranded females with one flipper tags
$p_{t, \text { bred,T2 }} \quad$ - applies to unbranded females with two flipper tags

## Survival and Reproduction

- Posterior distributions for parameters can be approximated with WinBUGS by defining a model in terms of the 4 random variables
- Some outcomes are actually latent (unknown) random variables, but their 'true' value can be imputed by MCMC
- Equivalent to a multi-state mark-recapture model


## Survival and Reproduction

- 2 chains of 25,000 iterations
- First 5,000 iterations discarded as burn-in
- Prior distributions:
- $\mu$ 's $\sim N\left(0,3.78^{2}\right)$
- $\sigma$ 's $\sim \mathrm{U}(0,10)$
- Other probabilities $\sim \mathrm{U}(0,1)$
- $\pi_{\mathrm{X}, 2} \sim \operatorname{Dirichlet}(1,1,1)$
- $\ln (\delta) \sim N\left(0,10^{2}\right)$
- Chains demonstrated convergence and good mixing


## Survival and Reproduction

- Model deviance can be calculated and compared for each model
- Same interpretation as for maximumlikelihood methods (e.g., GLM), but has a distribution not single value
- Comparison of distributions a reasonable approach to determine relative fit of the models


## Survival and Reproduction

- Fit of model to the data can be determined using Bayesian p-values with deviance as test statistic
- For each interaction in MCMC procedure, a simulated data set is created using current parameter values, and the deviance value calculated
- Frequency of simulated deviance values > observed deviance values provides a p-value for model fit


## Survival and Reproduction: Data

- 1990-2005 tagging cohorts
- Resights from 1997/8-2009/10 in main field season at Enderby Island
- Only considered confirmed breeders at this stage (status $=3$ )


## Survival and Reproduction: Data

- Retagged females dealt with using the Lazarus approach
- Approximately 2300 tagged females included in analysis


## Results (stricter defn.)

| Model | 2.5th <br> Percentile | Median | 97.5th <br> Percentile | B. p- <br> value |
| :--- | ---: | ---: | ---: | ---: |
| AC $\psi_{a, t, b}$ | 330381 | 330872 | 331335 | 0.21 |
| AC $\psi_{a, b}$ | 330700 | 331100 | 331500 | 0.22 |
| AC $\psi=1$ | 340397 | 340775 | 341138 | 0.02 |
| Linear $\psi_{a, t, b}$ | 330389 | 330843 | 331292 | 0.23 |
| Linear $\psi_{a, b}$ | 330600 | 331036 | 331437 | 0.25 |
| Linear $\psi=1$ | 340372 | 340753 | 341118 | 0.03 |

## Results (strict defn.)

- Tag loss

| Tags at $t-1$ | Tags at $t$ | Probability |
| :---: | :---: | :---: |
| 1 | 0 | $0.11(0.10,0.13)$ |
|  | 1 | $0.89(0.87,0.90)$ |
| 2 | 0 | $0.04(0.03,0.06)$ |
|  | 1 | $0.14(0.13,0.16)$ |
|  | 2 | $0.81(0.80,0.83)$ |

## Non-breeder in $t-1$ survival





## Breeder in $t-1$ survival




Year
Year

Non-breeder in $t$-1 repro.



## Breeder in $t-1$ repro.



## Non-breeder in $t-1$ survival





## Breeder in $t-1$ survival




## Survival vs Age




Non-breeder in $t$-1 repro.


## Breeder in $t-1$ repro.



## Breeding vs Age




