### Turn off powerpoint

https://www.youtube.com/watch?v=DsNJjKURSiw (first)

https://www.youtube.com/watch?v=\_D0ZQPqeJkk (sequence)

# Reverse time models in CMR (Pradel seniority)

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# Different classes of CMR (MR) models

#### **CJS models**

- Cormack-Jolly-Seber models
- Originally "Closed-population model"
- "conditional upon the animal being released alive at first encounter, and survival and catchability refer only to these marked animals"
- Developed initially for survival rates
- Translation: we can get extinction rates if we are only interested in the taxa that entered the fossil record and are sampled at least once.
- (almost never used in paleo situations because of what we are interested in)

#### **JS models**

- Jolly-Seber models
- "Open-population model"
- "unmarked animals in the population have the same probability of capture as marked animals in the population, i.e., that newly captured unmarked animals are a random sample of all unmarked animals in the population"
- Developed for parameters like abundance, population growth, recruitment.
- Translation: we can get extinction rates, origination rates, taxonomic richness and we include those taxa never sampled or have never entered the fossil record.

# Different classes of models

#### **CJS models**

- Cormack-Jolly-Seber (CJS) models
- "Closed-population model"
- http://www.phidot. org/software/mark /docs/book/pdf/ch ap3.pdf

Within each class, many different model types,

#### JS models

- Jolly-Seber (JS) models
- "Open-population model"
- http://www.phido t.org/software/m ark/docs/book/pd f/chap12.pdf

#### **RD models**

- Robust-design (RD) models
- Hybrid "openclosed population model"
- http://www.phido t.org/software/m ark/docs/book/pd f/chap15.pdf

with each model type, you can formulate many different specific models (e.g. time-varying, time constant, covariates)

### RT models

Pr. *CJS*(01101|*release in* 2) =  $\phi_2 p_3 \phi_3 (1 - p_4) \phi_4 p_5$ 

 $\phi_i$  = probablity that if alive in *i*, also alive in *i* + 1

Turn 01101 around = 10110

 $\gamma$  = seniority parameter (complement of origination probability in paleo speak)

 $\gamma_i$  = probablity that if alive in *i*, also alive in *i* - 1

Pr.  $RT(01101|last \ capture \ in 5) = \gamma_5(1-p_4) \gamma_4 p_3 \gamma_3 p_2(1-\gamma_2 p_1)$ 

## RT models

$$\phi_t N_t = \gamma_{t+1} N_{t+1}$$
$$E(\lambda_t) = E\left[\frac{N_{t+1}}{N_t}\right]$$
$$E(\lambda_t) = \frac{\phi_t}{\Phi_t}$$

$$E(\lambda_t) = \frac{\phi_t}{\gamma_{t+1}}$$

# Pradel seniority model

The Pradel seniority (1996) model ( $\phi_t$ ,  $\gamma_t$ ,  $p_t$ ) can be reparameterized in multiple ways,

including

 $(\phi_t, \lambda_t, p_t)$  population growth rate

 $(\phi_t, f_t, p_t)$ , recruitment as functions of covariates, for example

Note that the POPAN; the Link-Barker and Pradel-recruitment; and the Burnham JS and Pradel-lambda formulations.

# Pradel (1996): Likelihood expression to maximize

In terms of the  $u_i$ 's,  $n_i$ 's,  $v_i$ 's, and  $d_i$ 's,

$$L(\phi, p, \gamma, \mu) = \prod_{i=1}^{s} \left(\xi_{i}^{u_{i}}\right) \left(\gamma_{i}^{\sum_{ji}^{u_{j}}-\sum_{ji}^{v_{j}}}\right) \left(\mu_{i}^{n_{i}-d_{i}}\right) \\ \cdot \left[\left(1-\mu_{i}\right)^{d_{i}}\right] \left[\left(1-p_{i}(1-\mu_{i})\right)^{\sum_{j>i}^{u_{j}}}\right] \left(\chi_{i}^{v_{i}-d_{i}}\right) \\ / \left(\sum_{i=1}^{s} \xi_{i} \left\{\prod_{j=1}^{i-1} \phi_{j}(1-p_{j}(1-\mu_{j}))\right\} \left\{\prod_{j=i+1}^{s} \gamma_{j}\right\} p_{i}\right)^{\sum_{i=1}^{s}^{u_{i}}}.$$
(2)

Pradel 1996

### openCR to the rescue

#### 5.1 Non-spatial openCR models

#### 5.1.1 Parameters and model types

Table 2. Parameter definitions and default link functions (nonspatial models)

#### "Translations"

Parameter	Symbol	Link Description		р	Sampling probability
р	p	logit	capture probability (recapture probability for CJS)	phi	Survival probability (1-phi is extinction probability)
phi* b	$\phi \\ b$	logit mlogit	apparent survival entry probability cf PENT in MARK	b	Similar to 1-gamma but not "scaled"
f*	f	log per capita recruitment rate	f	Per capita origination/speciation	
gamma* lambda*	$\gamma \\ \lambda$	logit log	g population growth rate (finite rate of increase) g superpopulation size number of entrants	gamma	Seniority probability (1-gamma is origination probability)
superN BN	$N \\ B_N$	log log log		lamda	Net diversification rate
N	$N_j$			superN	Richness of the whole "data" (including those not seen)
				BN	Number of new taxa appearning
parameter:	s marked wi	th an asteris.	k are scaled by the interval between primary sessions.		

Ν

ters marked with an asterisk are scaled by the interval between primary sessions.

Table 3. Parameters of nonspatial openCR models

Type	Alias	р	$_{\rm phi}$	b	f	gamma	lambda	$\operatorname{superN}$	$_{\rm BN}$	Ν
CJS		+	+							
JSSAbCL	PLBb	+	+	+						
JSSAfCL	PLBf	+	+		+					
JSSAgCL	PLBg	+	+			+				Condi
JSSAICL	PLBI	+	+				+			
JSSAb		+	+	+				+		
JSSAf		+	+		+			+		
JSSAg		+	+			+		+		Open
JSSA1		+	+				+	+		open
JSSAB		+	+						+	
JSSAN		+	+							+

itional (closed populations)

populations, hence the estiamtes of some form of N

Number of taxa in time interval

Models with type ending in CL are of the Pradel–Link–Barker type, with aliases as shown.

https://cran.r-project.org/web/packages/openCR/vignettes/openCR-vignette.pdf

# Chapters in MARK book most relevant (if not using MARK)

- Chapter 1 (introduction)
- Chapter 4 (dipper example, but skip the MARK specific bits)
- Chapter 5 (goodness of fit –not covered in lectures but important)
- Chapter 6 (more on covariates and link functions)
- Chapter 11 (individual covariates)
- Chapter 12 (Pradel) and 13 (JS models in general)
- Liow, L.H. and Nichols, J.D. (2010) Estimating rates and probabilities of origination and extinction using taxonomic occurrence data: Capture-recapture approaches. In *Short Courses in Paleontology: Quantitative Paleobiology* (Hunt, G. and Alroy, J., eds), pp. 81–94, Paleontological Society (Supplementary has step by step for MARK if you are a windows user)

# Reverse-Time (RT) models

- <u>https://projecteuclid.org/journals/statistical-science/volume-31/issue-2/And-the-First-One-Now-Will-Later-Be-Last/10.1214/16-STS546.full</u> Nice free download review paper by Jim Nichols
- <u>https://sites.google.com/site/cmrsoftware/lecture-lab-schedule/week-10-open-cmr-abundance-and-recruitment/pradel-temporal-symmetry-models</u>
- <u>http://www.phidot.org/software/mark/docs/book/pdf/chap13.pdf</u> The relevant MARK book chapter