

# Population pedigree process of the Chatham island black robin: A case of human-assisted spread of a maladaptive behavior in a critically endangered bird

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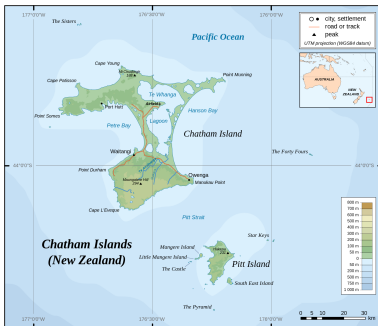
Ecological History of Black Robins

Likelihood of Population Pedigrees

Current & Future Plans

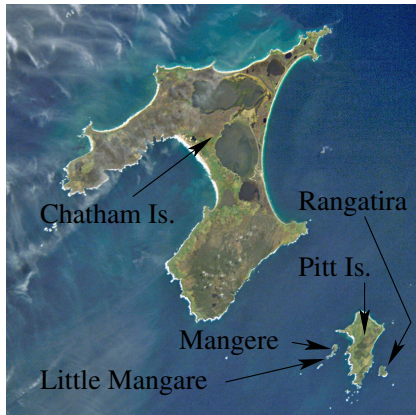
# Part I

## Map of Antarctica / Chatham Islands (New Zealand)



- ▶ The Chatham Islands lie 800 kms east of Christchurch.
- ▶ Two main islands – Chatham Island and Pitt Island

## Chatham Islands (New Zealand)



- ▶ Many smaller islands – including Little Mangere, Mangere and Rangatira
- ▶ The islands have only emerged above sea level in the last 4 million years and are part of the Chathams rise connected below ocean to NZ.
- ▶ The climate is cool and wet with salt-laden winds all year round.

## Chatham Islands (New Zealand)

### Rangatira Island

- ▶ is the third largest island in the Chatham Islands
- ▶ covers an area of 218 hectares (539 acres)
- ▶ is a gazetted nature reserve since 1953
- ▶ is now home to many endemic species
- ▶ is **home to black robins** – saved from near extinction by team led by Don Merton in the 1980s

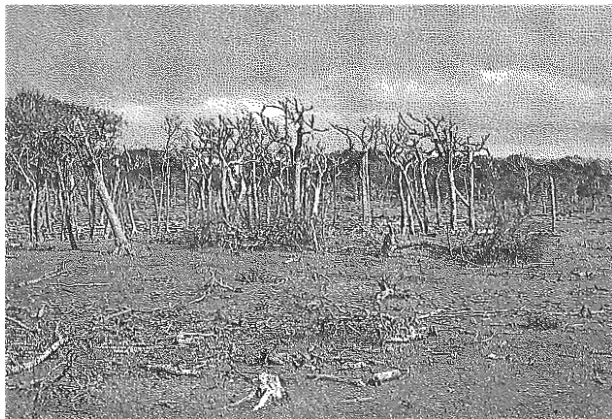


## A Chatham island Black Robin in Rangatira today



## Decimation and Conservation

Whaling (< 1964), Sealing (< 1926) & Farming destroyed Ecosystems



## Decimation and Conservation

By 1938 black robins were wiped off from all the Chatham islands except for a few pairs on Little Mangare (a rocky outcrop of 15ha of bush)



## Decimation and Conservation

### Crown buys Rangatira and Magere Islands



## Decimation and Conservation

### A Massive Restoration Ecological Effort



## Decimation and Conservation

### Ecological Engineering of Native Flora and Predator-Proofing



## Decimation and Conservation

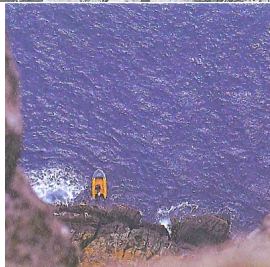
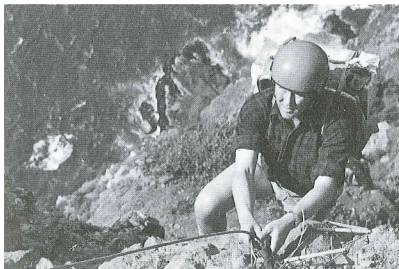
Native fauna (sea-birds) start returning



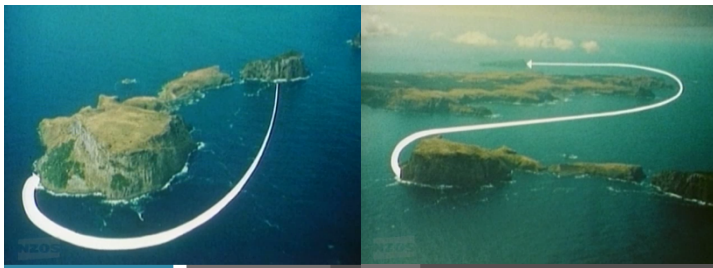
## Early Studies and Relocation in 1980s

### Little Mangare Island

- ▶ Studies in 1970s by Douglas Flack on Little Mangare (15ha) tracked a handful of breeding pairs and
- ▶ recommended translocation to nearby Mangere (113ha) and Rangatira islands (218ha)



## Species Recovery Program in 1980s



Last 7 robins were moved.

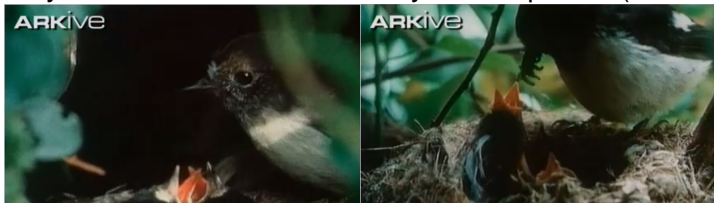


## Species Recovery Program in 1980s

Eggs were removed after being laid to encourage egg-laying



They were hatched and raised by foster species (tomtits)



## Species Recovery Program in 1980s

the foster-cared chicks were transferred to black robin nests for sexual imprinting by its own species



## Species Recovery Program in 1980s

Managements ceased when the population reached about 100

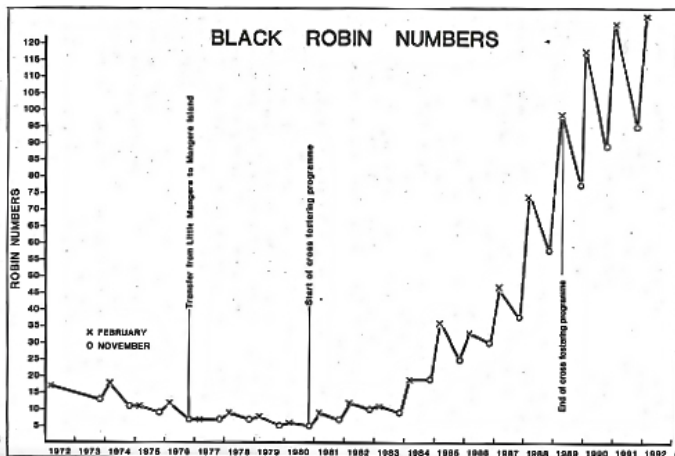


Fig. 22. Black robin numbers

## Species Recovery Program in 1980s

Well-laid Eggs

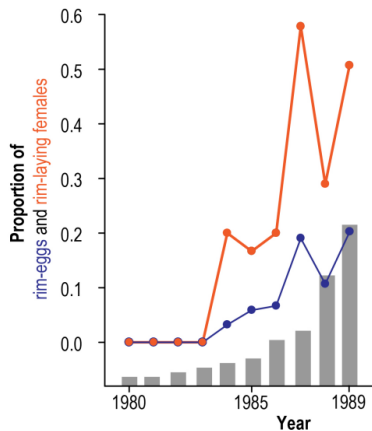


Rim-laid Egg



Unfortunately, a maladaptive behavioural trait of “rim-laying” also increased with the population

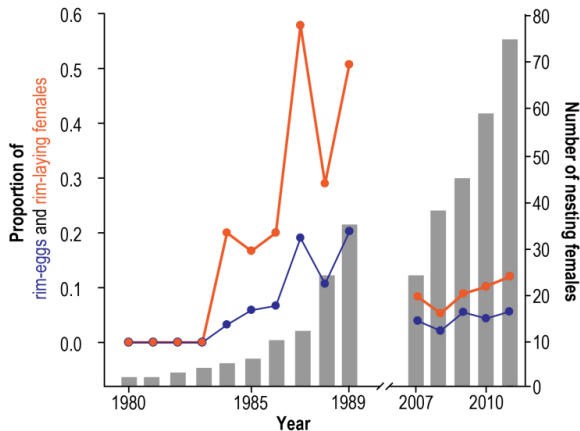
## The Conservation Dilemma



Rim-laying increases in 1980s

- ▶ **Conservation Dilemma**  
– when to cease management?
- ▶ Need managed pop. size to ↑
- ▶ But rim-laying trait also ↑
- ▶ Don Merton's team ceased management when 50% of females were rim-layers by 1989
- ▶ **Our Question:** Is rim-laying a heritable trait?

## The Conservation Dilemma



Rim-laying increases in 1980s

but between 2007 and 2011 (unmanaged phase) rim-laying is lower

## The Conservation Dilemma

<b>Fitness</b>	<b>Normal-laying</b>	<b>Rim-laying</b>	<b>Statistics</b>			
<b>Measure</b>	<b>Females (<math>\pm</math> std. err.)</b>	<b>Females (<math>\pm</math> std. err.)</b>	<b><i>n</i></b>	<b><math>\chi^2</math></b>	<b>df</b>	<b>p-value</b>
Clutch size	2.02 ( $\pm$ 0.03)	1.12 ( $\pm$ 0.11)	281	10.98	1	0.0009
Hatching success	1.48 ( $\pm$ 0.05)	0.61 ( $\pm$ 0.12)	260	29.48	1	<0.001
Fledgling success	1.03 ( $\pm$ 0.06)	0.50 ( $\pm$ 0.13)	242	9.41	1	0.0021

Data from 2007–11 (during which rim eggs were not repositioned) shows that females that laid rim eggs had a significantly reduced clutch size (i.e. number of eggs laid inside nests that were incubated), and decreased hatching and breeding success compared to normal-laying females. We obtain p-values from likelihood ratio tests with generalized linear mixed models of data with sample size *n*.

doi:10.1371/journal.pone.0079066.t001

### Rim-laying females have reduced

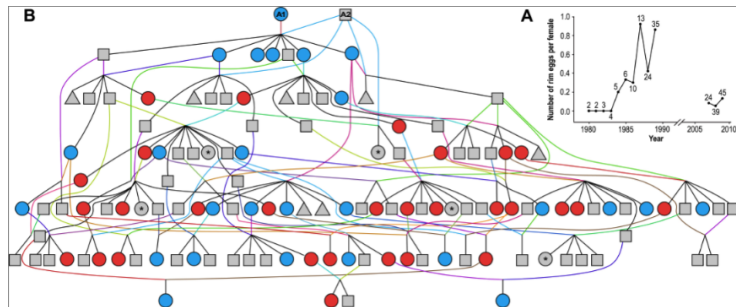
- ▶ clutch size
- ▶ hatching success
- ▶ fledgling success

during 2007-2011 (unmanaged phase)

**Our Hypothesis:** If rim-laying is heritable then natural selection would purge it from the population during unmanaged phase.

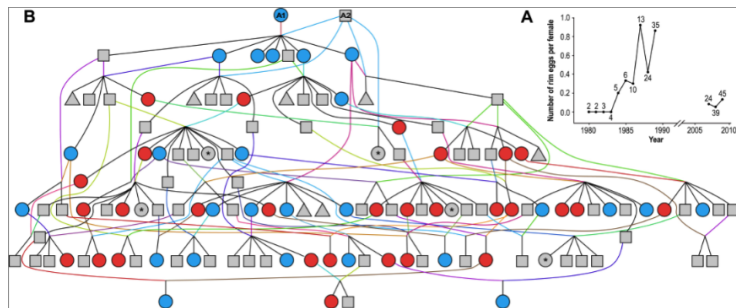
**Need to show:** rim-laying is heritable

## Highly Looped Black Robin Pedigree in 1980s



circle = female, square = male, triangle = unknown sex,  
red circle = rim-layer, blue circle = non-rim-layer

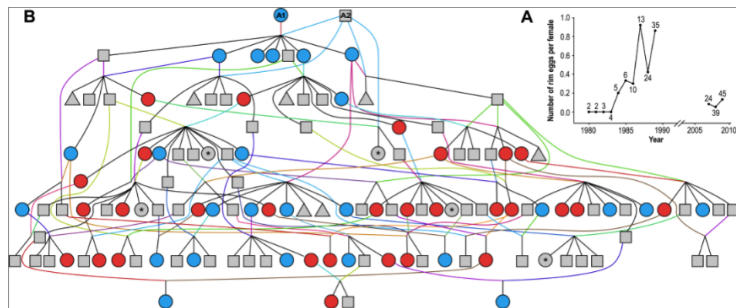
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**Want:** The likelihood of the observed rim-laying phenotypes on this population pedigree. **Trouble:** The likelihood via Peeling Algorithm (Cannings, Thompson & Skolnick 1978) in standard pedigree software runs out of RAM!

## Likelihood of the Phenotypes on the Pedigree

For the likelihood we need:

1. simplest Model for Pedigree

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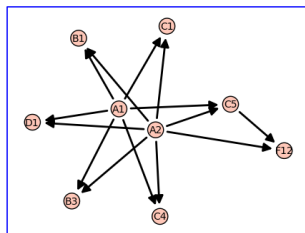
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1. simplest Model for Pedigree
2. Phenotypes and Genotypes
3. Model for Mendelian Inheritance
4. Likelihood = the proportion of joint genotypic configurations that are compatible with the observed phenotypes under the model of inheritance on the observed pedigree

## Simple Pedigree

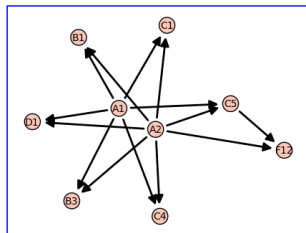


A pedigree is a directed acyclic graph  $\mathcal{G} := (\mathbb{V}, \mathbb{E})$  in which  $\mathbb{V}$  partitions a set of individuals (males, females, unknown-sex):

$$\mathbb{V} = \mathbb{M} \cup \mathbb{F} \cup \mathbb{U}$$

and where each vertex either has no-incoming arc or two incoming arcs, with one from a vertex in  $\mathbb{M}$  and the other from a vertex in  $\mathbb{F}$ .

## Simple Pedigree



Let the female and male founders be

$$\mathbb{A} := \{A1, A2\}$$

For an individual

$$u \in \mathbb{V} \setminus \mathbb{A}, \text{ let } M_u \text{ and } F_u$$

denote its mother and father, respectively.

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Let the phenotypes of a set of individuals

$$\mathbb{U} := \{u_1, \dots, u_m\}$$

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$$\phi(\mathbb{U}) := \{\phi(u) : u \in \mathbb{U}\} = \{\phi(u_1), \dots, \phi(u_m)\}$$

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So, with  $\sim 100$  individuals in 1980-89:  $|\Gamma^{\mathbb{V}}| = 4^{|\mathbb{V}|} > 10^{60}$

## Mendelian Inheritance – Prob. of Genotype

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$$\Pr(\gamma(u) \mid \gamma(M_u), \gamma(F_u), \mathcal{M}_h^c)$$

$$= \begin{cases} \frac{1}{4} & \text{if } c = \alpha, \gamma_m(u) \in \{\gamma_m(M_u), \gamma_f(M_u)\}, \\ & \gamma_f(u) \in \{\gamma_m(F_u), \gamma_f(F_u)\} \\ \frac{1}{2} & \text{if } c = z, \gamma_m(u) = \gamma_f(M_u), \\ & \gamma_f(u) \in \{\gamma_m(F_u), \gamma_f(F_u)\}, u \in \mathbb{M} \\ \frac{1}{2} & \text{if } c = z, \gamma_m(u) = \gamma_m(M_u), \\ & \gamma_f(u) \in \{\gamma_m(F_u), \gamma_f(F_u)\}, u \in \mathbb{F} \\ 0 & \text{otherwise.} \end{cases} \quad (2)$$

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$$\Pr(\phi(u) \mid \gamma(u), \mathcal{M}_h^c) = \begin{cases} 1 & \text{if } \phi(u) = 1, \gamma(u) \in \Gamma \setminus \{(a, a)\}, h = D, u \in \mathbb{L} \\ 1 & \text{if } \phi(u) = 0, \gamma(u) \in \{(a, a)\}, h = D, u \in \mathbb{L} \\ 1 & \text{if } \phi(u) = 0, \gamma(u) \in \Gamma \setminus \{(a, a)\}, h = R, u \in \mathbb{L} \\ 1 & \text{if } \phi(u) = 1, \gamma(u) \in \{(a, a)\}, h = R, u \in \mathbb{L} \\ 1 & \text{if } u \notin \mathbb{L} \\ 0 & \text{otherwise.} \end{cases} \quad (3)$$

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$$\Pr(\mathcal{M}_h^c, \gamma(\mathbb{A}) \mid \mathcal{G}, \phi(\mathbb{V})) = \frac{\Pr(\phi(\mathbb{V}) \mid \mathcal{G}, \mathcal{M}_h^c, \gamma(\mathbb{A})) \Pr(\mathcal{M}_h^c, \gamma(\mathbb{A}))}{\sum_{\substack{c \in \{a, z\} \\ h \in \{D, R\} \\ \gamma(\mathbb{A}) \in \Gamma^{\mathbb{A}}}} \Pr(\phi(\mathbb{V}) \mid \mathcal{G}, \mathcal{M}_h^c, \gamma(\mathbb{A})) \Pr(\mathcal{M}_h^c, \gamma(\mathbb{A}))} \quad (4)$$

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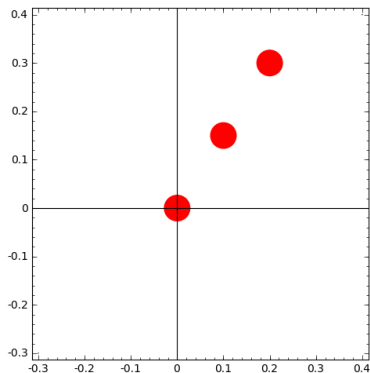
We assume a uniform prior probability  $\Pr(\mathcal{M}_h^c, \gamma(\mathbb{A})) = \frac{1}{64}$  over the  $2 \times 2 \times 4^2 = 64$  models in the family:

$$\{(\mathcal{M}_h^c, \gamma(\mathbb{A})) : c \in \{a, z\}, h \in \{D, R\}, \gamma(\mathbb{A}) \in \Gamma^{\mathbb{A}}\} .$$

## Likelihood Computation - A Pedagogical Example

### Sequential Monte Carlo (SMC) Algorithm for Rare Event Simulation

(Johansen, Del Moral & Doucet, 2006)



What is Prob. of Hitting First Red dot and then Second Red Dot?

## Likelihood Computation - A Pedagogical Example

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(Johansen, Del Moral & Doucet, 2006)

Estim. Prob. Hitting First Red dot =  $1/9$

## Likelihood Computation - A Pedagogical Example

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Estim. Prob. Hitting First and Second Red Dots =  $1/9 \times 1/9 = 1/81$

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$\Pr(\phi(\mathbb{V}) \mid \mathcal{G}, \mathcal{M}_h^c, \gamma(\mathbb{A}))$ , the likelihood in (4), is computed using a sequential Monte Carlo Algorithm.

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The strategy involves sequentially growing the pedigree as a nested and increasing family of sub-graphs via a breadth-first expansion from the founders A1 and A2.

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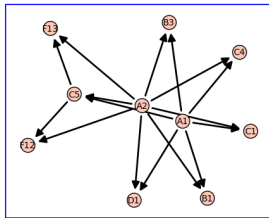
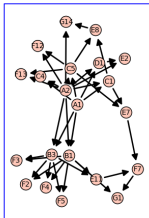
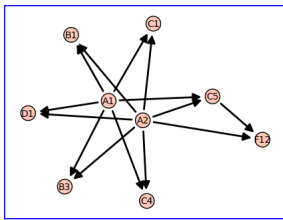
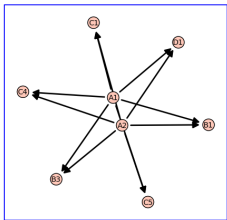
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Let  $\mathbb{A} = \mathbb{V}_0 \subset \mathbb{V}_1 \subset \dots \subset \mathbb{V}_T = \mathbb{V}$  denote the increasing sequence of vertices in  $\mathcal{G}$  obtained by a breadth-first expansion from  $\mathbb{V}_0$

## Sequential Monte Carlo on Nested Combinatorial Structures



## Sequential Monte Carlo on Nested Combinatorial Structures

- ▶ At  $t = 0$ , initialize all particles at the founder nodes
  - FOR  $i = 1, \dots, N$ ; DO:
    - ▶  $\gamma_0^{(i)}(u) \leftarrow \gamma(u)$ , for each founder  $u \in \mathbb{V}_0 = \mathbb{A}$
    - ▶  $W_0^{(i)} \leftarrow \prod_{u \in \mathbb{V}_0} \Pr(\phi(u) \mid \gamma_0^{(i)}(u), \mathcal{M}_h^c)$
- ▶ FOR  $t = 1, \dots, T$ ; DO:
  - ▶ Resample to obtain  $\left\{ \frac{1}{N}, \left( \hat{\gamma}_{t-1}^{(i)}(u) : u \in \mathbb{V}_{t-1} \right) \right\}_{i=1}^N$
  - ▶ FOR  $i = 1, \dots, N$ ; DO:
    - ▶ Extend  $\left\{ \hat{\gamma}_{t-1}^{(i)}(u) : u \in \mathbb{V}_{t-1} \right\}$  to  $\left\{ \gamma_t^{(i)}(u) : u \in \mathbb{V}_t \right\}$  by proposing genotypes for each new offspring node in  $\mathbb{V}_t \setminus \mathbb{V}_{t-1}$  according to  $\mathcal{M}_h^c$  and the genotypes of its parent nodes in  $\mathbb{V}_{t-1}$  specified by the sub-pedigree  $\mathcal{G}[\mathbb{V}_t]$ .
    - ▶  $W_t^{(i)} \leftarrow \prod_{u \in \mathbb{V}_t \setminus \mathbb{V}_{t-1}} \Pr(\phi(u) \mid \gamma_t^{(i)}(u), \mathcal{M}_h^c)$
- ▶ Estimate  $\Pr(\mathcal{G}, \phi(\mathbb{V}) \mid \mathcal{M}_j^c, \gamma(\mathbb{A}))$  by  $\prod_{t=0}^T \hat{Z}_t$ ,  $\hat{Z}_t = \frac{1}{N} \sum_{i=1}^N W_t^{(i)}$ .

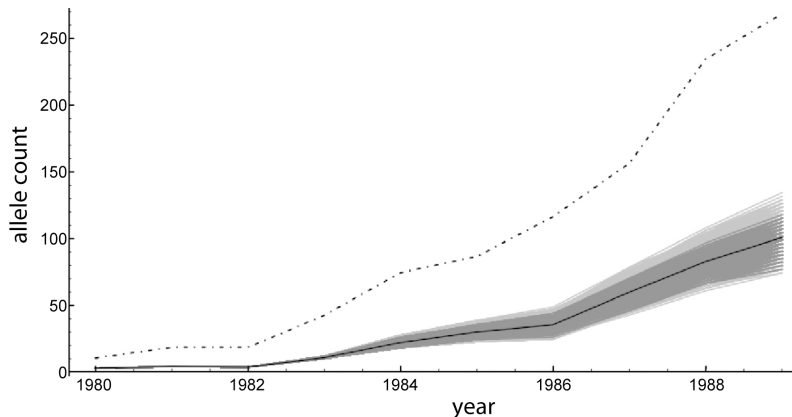
## Model Selection – Results

<b>Model</b>	<b>Founder Genotype</b>	<b>Mendelian</b>	<b>Chromosomal</b>	<b><math>-2 \times \log</math></b>	<b>Posterior</b>
<b>Number</b>	<b>Female <math>\times</math> Male</b>	<b>Inheritance</b>	<b>Location</b>	<b>likelihood</b>	<b>Probability</b>
1	Aa $\times$ AA	Recessive	Autosome	92.250	0.0013
2	AA $\times$ Aa	Recessive	Autosome	92.428	0.0012
3	Aa $\times$ Aa	Recessive	Autosome	87.486	0.0142
4	aa $\times$ Aa	Dominant	Autosome	79.006	0.9832
5	aa $\times$ Aa	Dominant	Z	96.988	0.0001

Log likelihood and posterior probability of the phenotypes conditional on the pedigree, founder genotypes and model of inheritance. Z is a sex chromosome. The prior probability of each model is uniformly distributed and all other models considered (see text) have zero likelihood.  
doi:10.1371/journal.pone.0079066.t002

The best model (Model 4) is the simple autosomal dominant model with homozygous founding female (aa) and heterozygous founding male (Aa).

## Allele Trajectory – Results



Inferred trajectories of allele A under Model 4 between 1980 and 1989. The mean trajectory (black); 50% and 95% confidence sets (dark & light grey);  $2N$  (dash-dotted).

## Phenotype Permutation Test of Heritability

- ▶ Under Null Hyp.: Environmental (non-genetic) Basis to Rim-Laying
- ▶ Permuting female phenotypes would leave the null likelihood unchanged
- ▶ Use likelihood under Model 4 as the test statistic
- ▶ p-value = fraction of 10000 phenotype permutations have a likelihood greater than the observed likelihood
- ▶ Result: p-value = 0.03

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- ▶ In the case of black robins the managers seemed to have succeeded by stopping management when half the population were rim-layers
- ▶ Merton suspected rim-laying was heritable (persn. commn. to Massaro)

## Conclusions - Part I contd...

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## Conclusions - Part I contd...

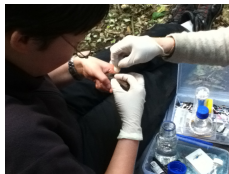
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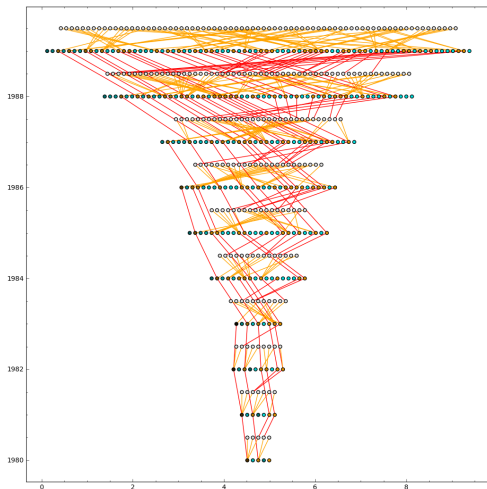
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- ▶ To appreciate the intensity of field operations and limitations of biomathematical models read: *The black robin: saving the world's most endangered bird*, David Butler and Don Merton, Oxford University Press, 1994.

# Part II

## Insights from field work in November 2011

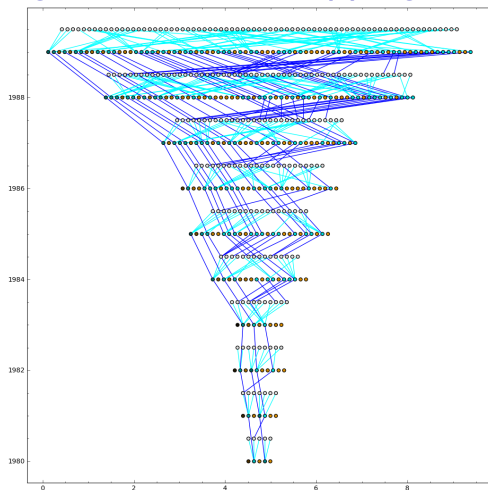


## Temporal Pedigrees with Overlapping Generations



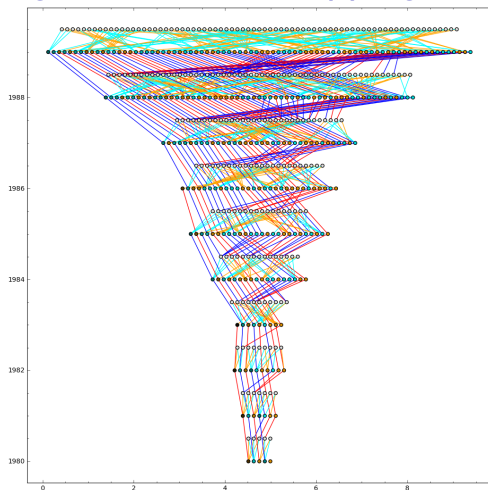
Female Population Tree during Field Conservation in 1980s

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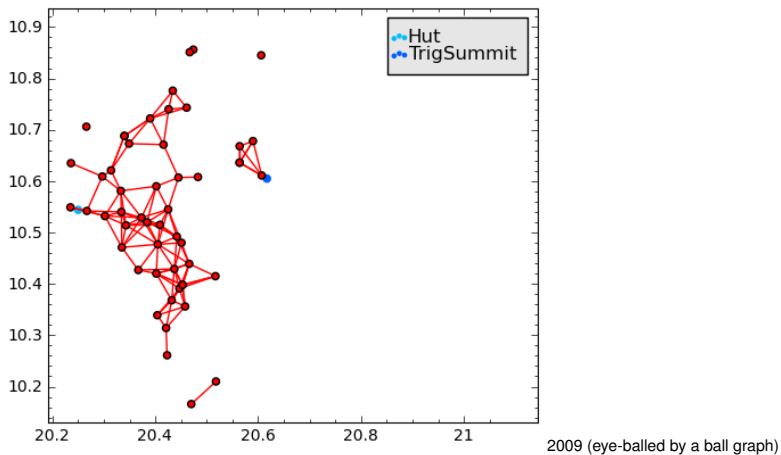


Population Pedigree during Field Conservation in 1980s

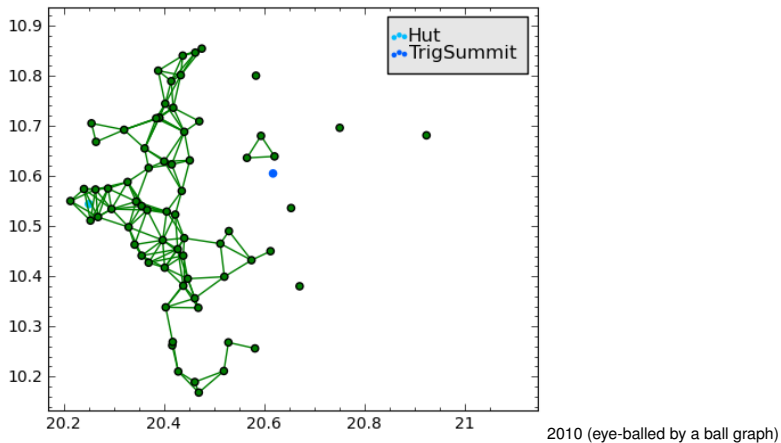
## Temporal Pedigrees with Overlapping Generations

Coalescent Sub-Pedigree of the 1989 population

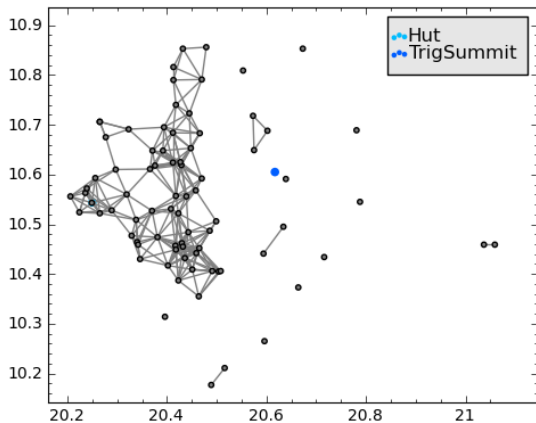
## Male Territory Graphs by year



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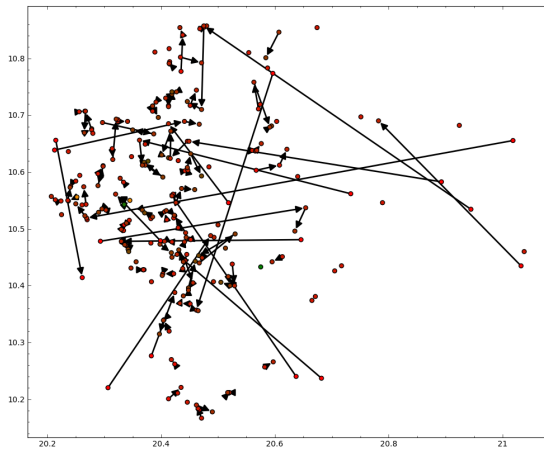


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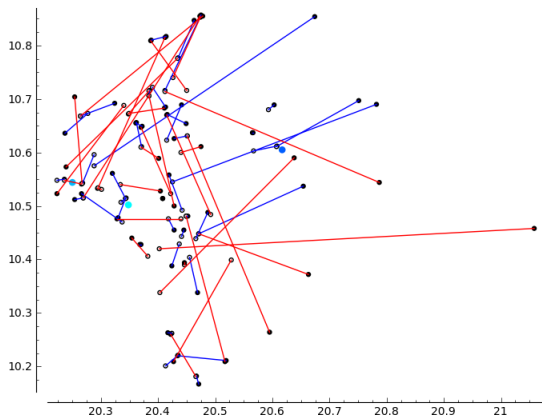
2011 (eye-balled by a ball graph)

## Male Territorial Dynamics – yearly nest site relocation



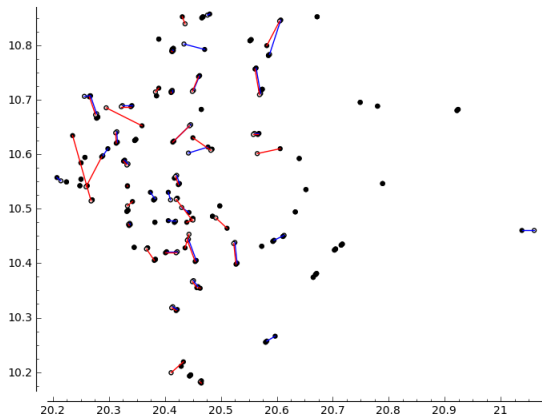
## Male / Female yearly nest to nest distance

sex-specific distance between home nest and first nest

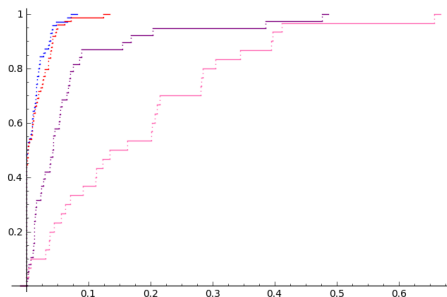


## Male / Female yearly nest to nest distance

sex-specific distance between nest at age  $\geq 1$  and next nest



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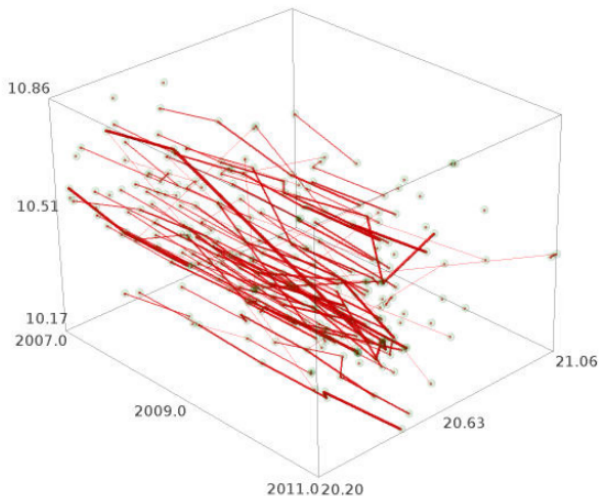


- ▶ Permutation Test to Reject  $H_0$  : male dist = female dist (10<sup>5</sup> MC samples)
- ▶ Strongly reject  $H_0$  for home to first nest (pv = 0.00025)
- ▶ Fail to reject  $H_0$  for nest at age  $\geq 1$  to next nest (pv = 0.14)

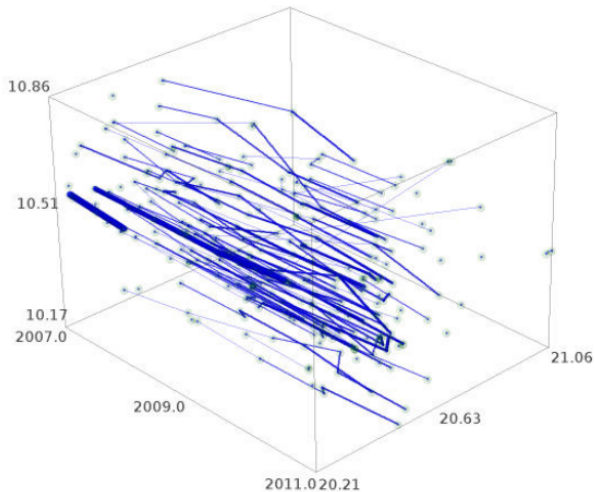
male / female distance from home nest to first nest

male / female distance from nest at age  $\geq 1$  to next nest

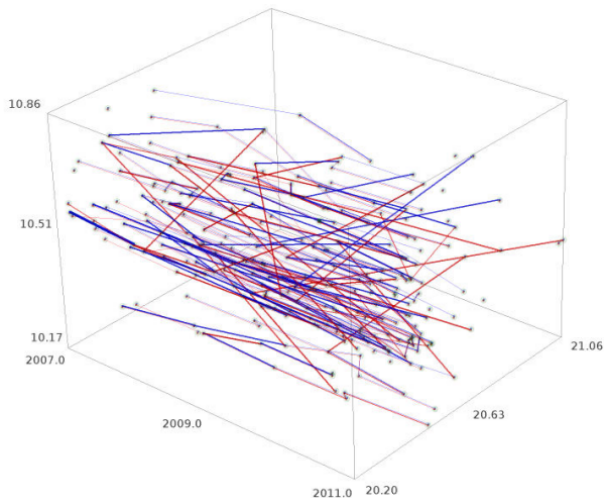
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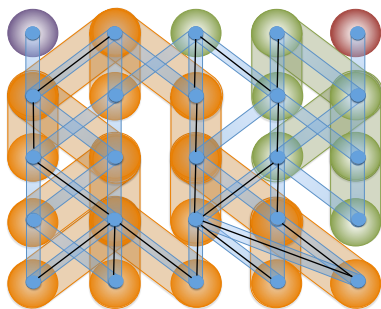


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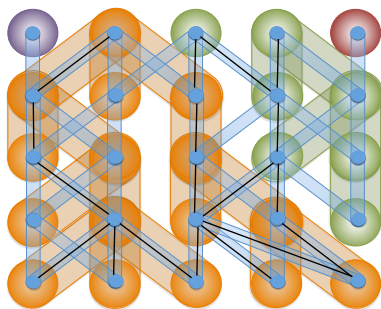
## Step I: Notions of Molecular continuums within W-F Population Pedigrees

a homotopy between Kingman Coalescent Trees and Chang's Pedigree (RS, B. Thatte & A. Veber)



Zygotic, cytoplasmic, karyotic and sub-karyotic pedigrees of a Wright-Fisher population with five eukaryotic diploid individuals

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Prob. Seminar on October 6th 2014 4:00PM in Malott Hall

Ancestries of Recombining Population Pedigrees: A Discrete Structural Perspective

## Conclusions - Part II

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- ▶ PLAN: continue to work on Part II @Cornell in 2014

Thank you!

Funds for Theory:

- ▶ School of Maths & Stats (solar panels for remote computing in 2011; Sabbatical grant 2014),
- ▶ Research Chaire in 2013: Vieola Environment - French Natural History Museum - Ecole Polytechnique.