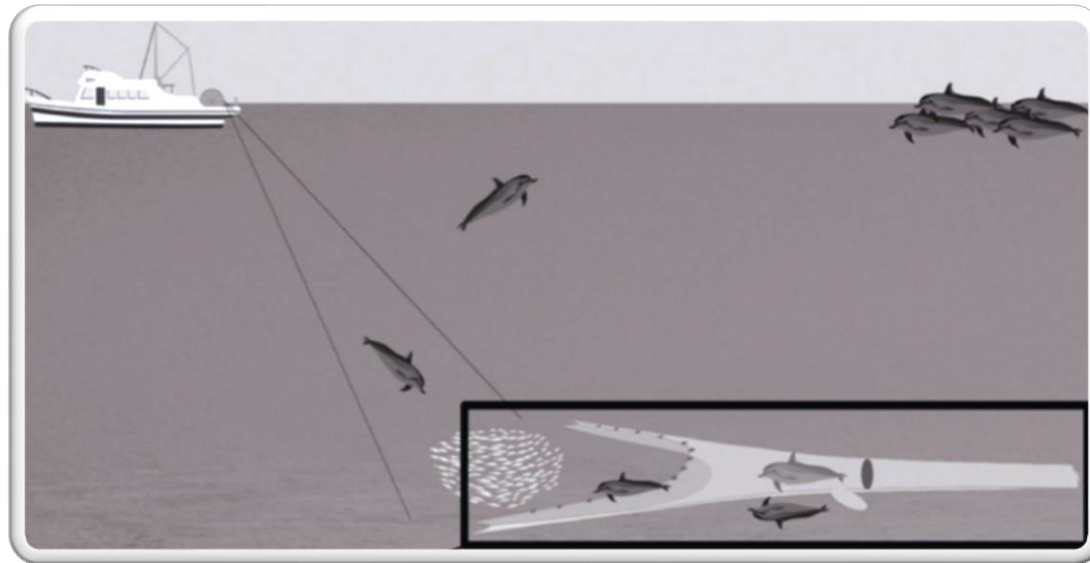


***SAMSE:***

# A Stochastic Model to Set Sustainable Limits to Wildlife Mortality in a Changing World

Oliver Manlik, Robert C. Lacy,  
William B. Sherwin, Hugh Finn,  
Neil R. Loneragan, Simon J. Allen

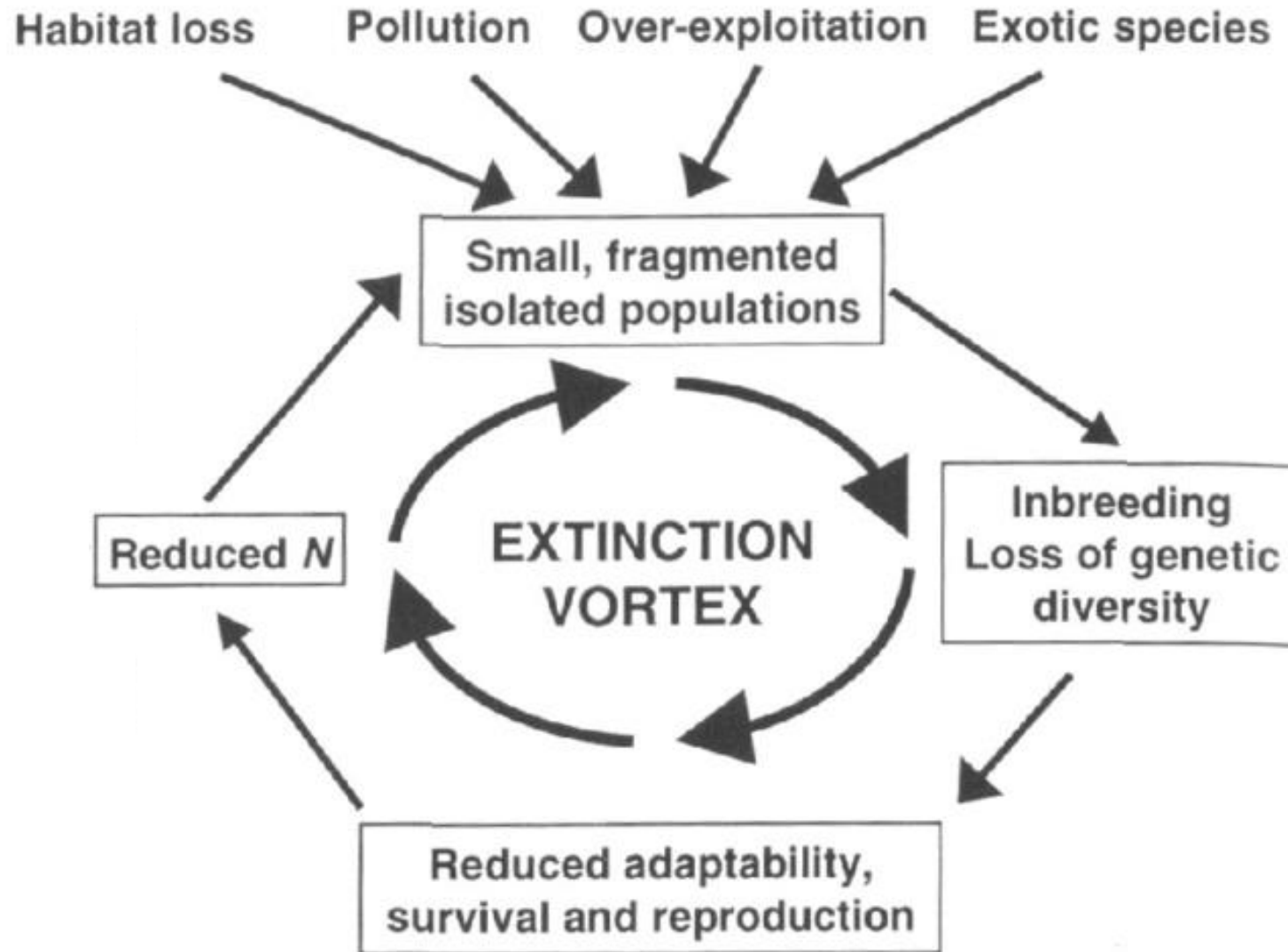


**UAEU**



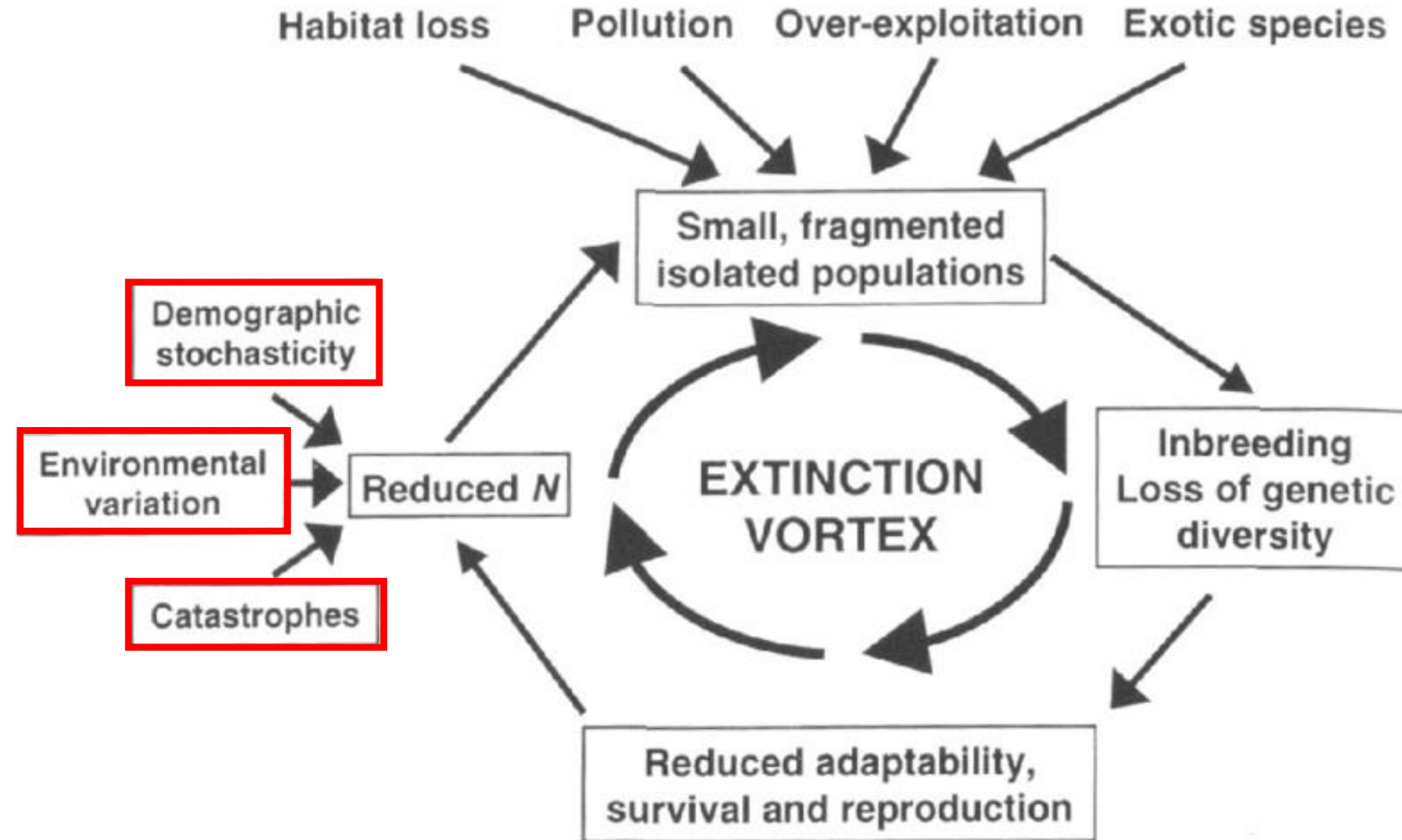
جامعة الإمارات العربية المتحدة  
United Arab Emirates University

# Extinction Vortex

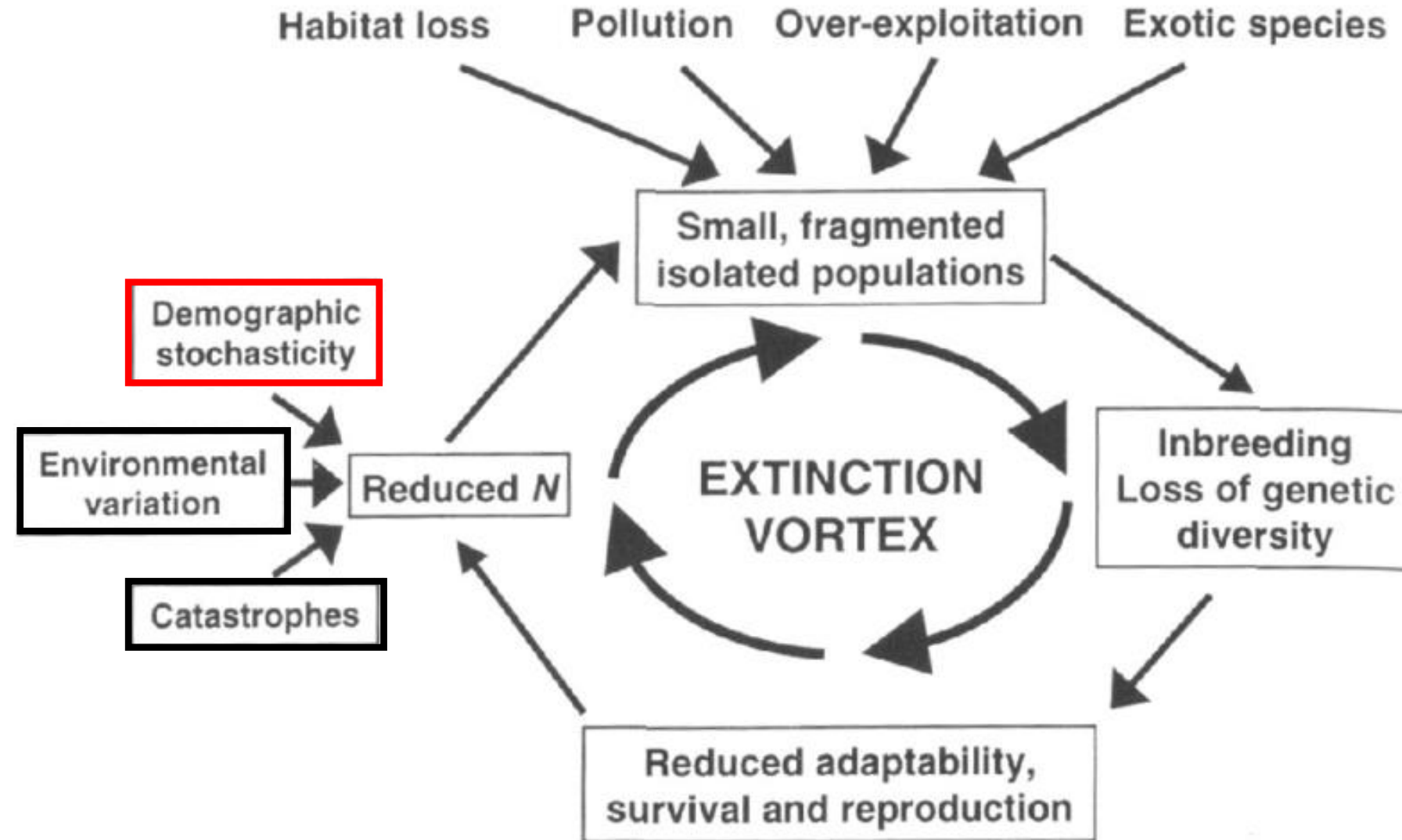


# Stochastic Events Accelerate Extinction Vortex

**Stochastic Events:**  
Random (chance) events  
that can affect  
population dynamics



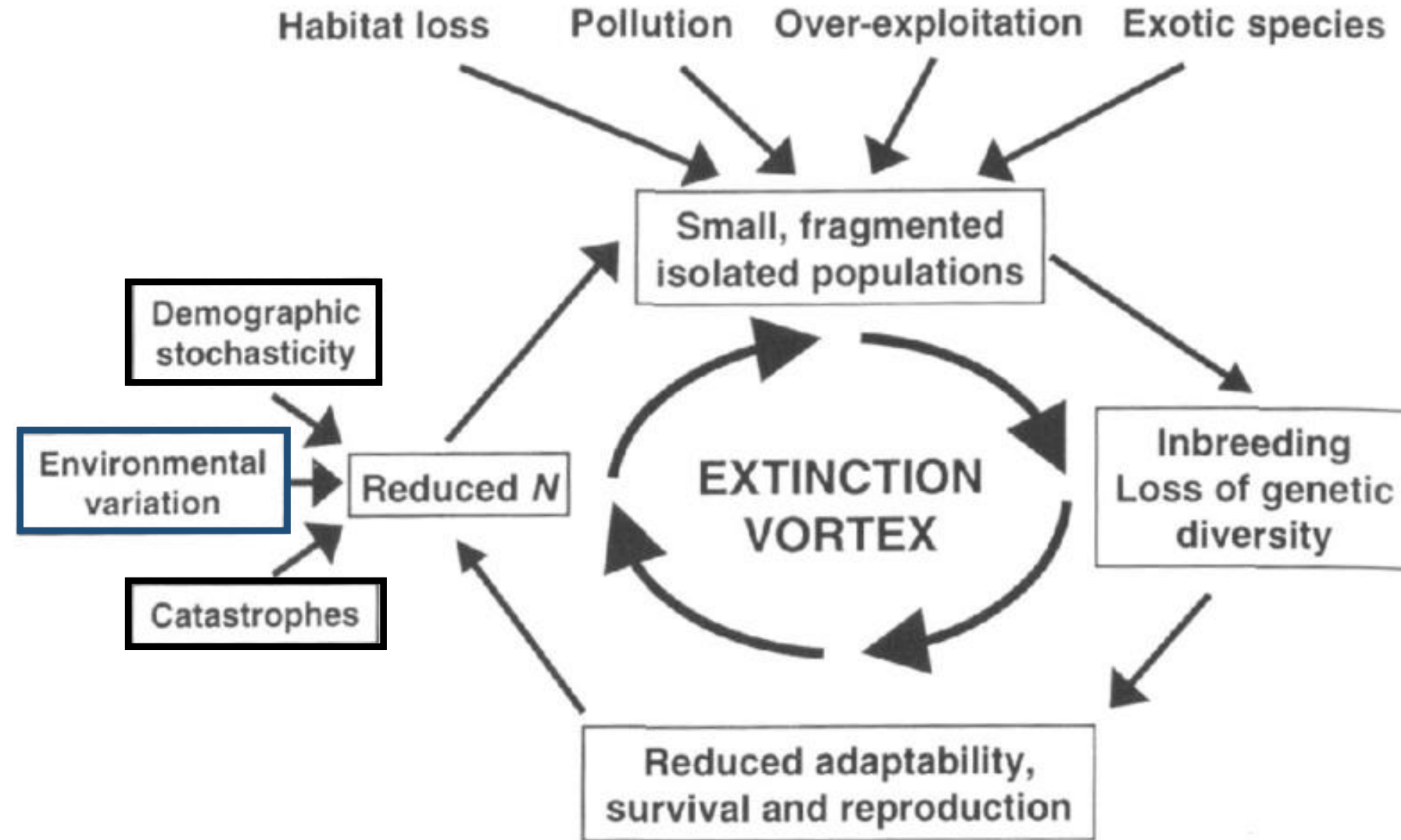
# Stochastic Events Accelerate Extinction Vortex



**Stochastic Events:**  
Random (chance) events  
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- **Demographic stochasticity**  
random fluctuation in  
obs. birth rate, death  
rate & sex ratio  
resulting from  
stochastic sampling  
processes

# Stochastic Events Accelerate Extinction Vortex



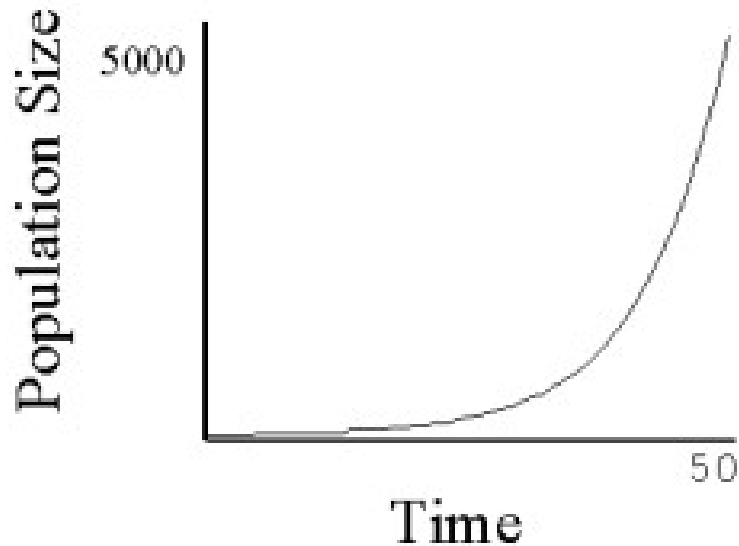
**Stochastic Events:**  
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- **Demographic stochasticity**
- **Environmental stochasticity:** fluctuation in probabilities of birth and death due to random fluctuations in the environment

## Stochastic Events can affect Population growth ( $r$ )

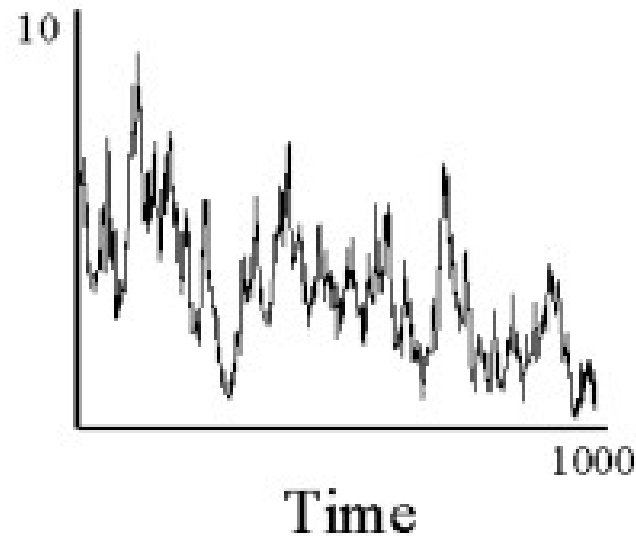
Long-term growth rates can be negative even with average positive  $r$ , if variation in growth rate is high

mean  $r = 0.125$ , SD = 0



**Deterministic**  
(no stochasticity)

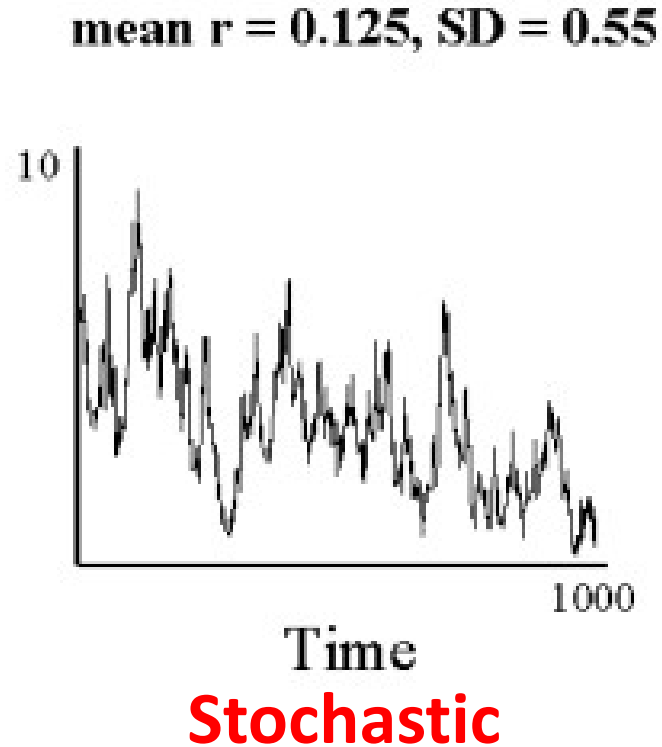
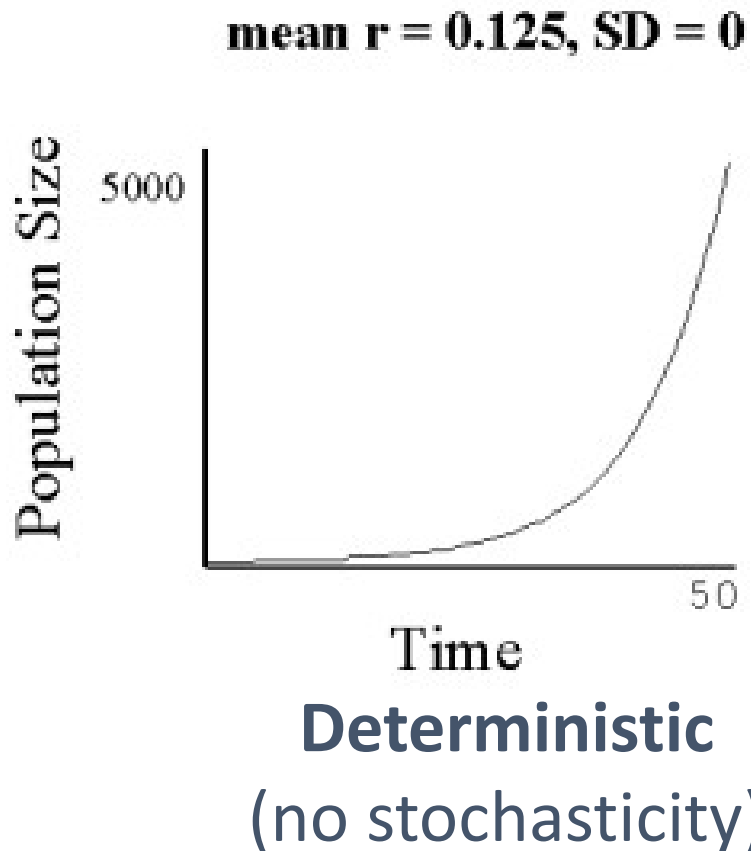
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**Stochastic**

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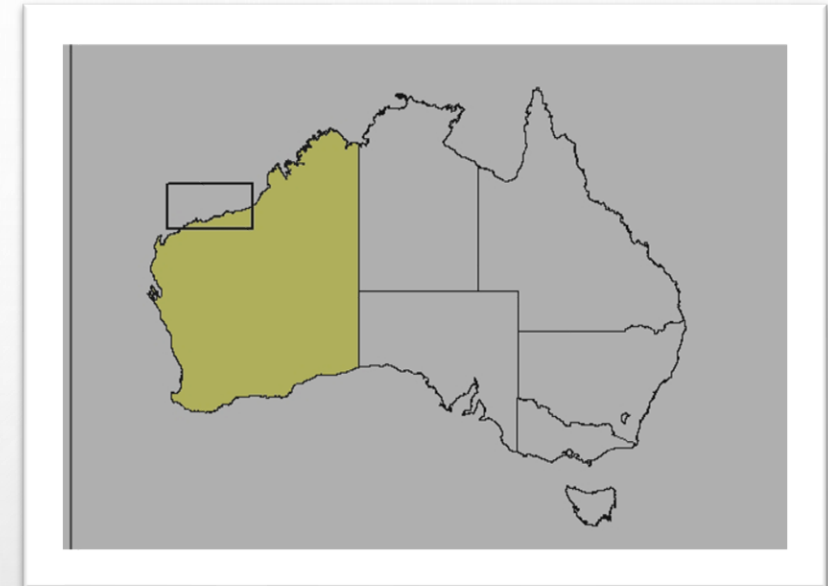


But **stochasticity** is **often ignored** in simple population models (e.g. Leslie matrix), especially when determining sustainable limits to wildlife mortality



# PILBARA FISH TRAWL FISHERY: BYCATCH OF BOTTLENOSE DOLPHINS

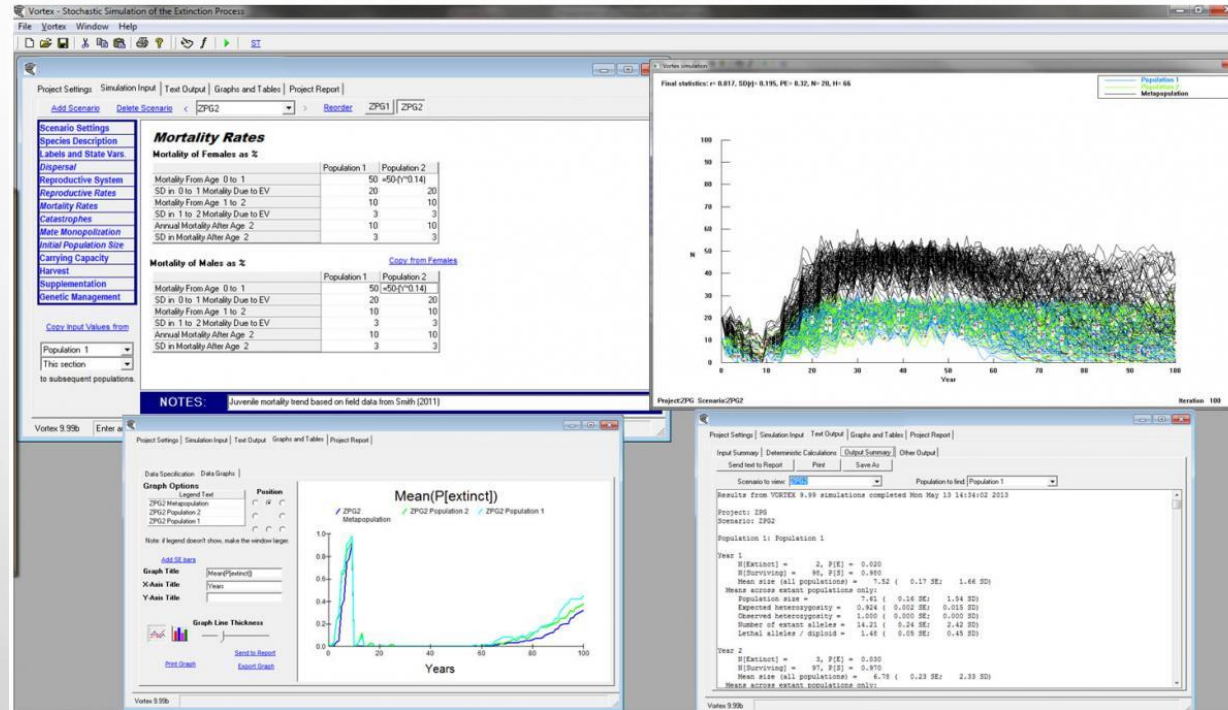
- **Pilbara Fish Trawl Fishery** (northern Western Australia) targets variety of scalefish species
- But also captures protected and threatened species, including **bottlenose dolphins** (*Tursiops truncatus*)



- **Bycatch rates of bottlenose dolphins:**
  - **Skippers' logbooks** (2012-2017): **24.5/yr** (mean) (73.5/3-yr)
  - **Independent Observers** (2002; 2006-2009): **50/yr** (150/3-yr)
  - **Western Australian Department of Fisheries:** **75/yr** (225/3-yr)  
“number of dolphins caught by the fishery should be < 75/yr”



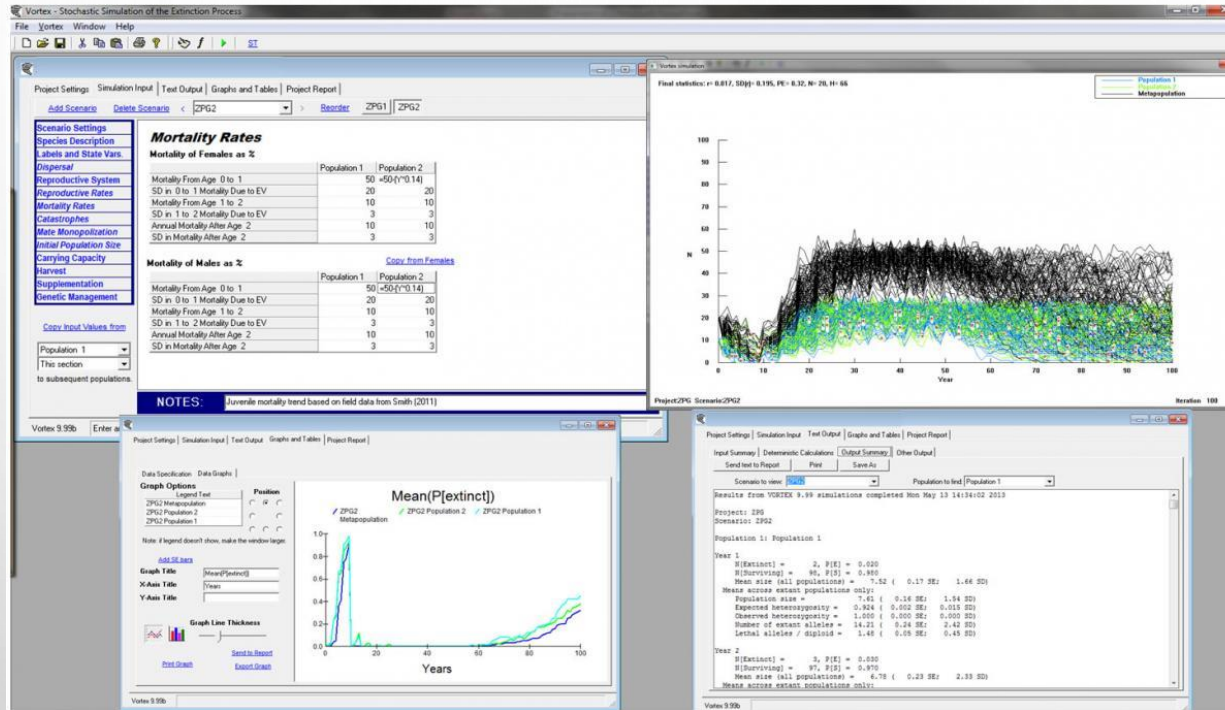
# STOCHASTIC POPULATION MODEL USING VORTEX



<https://www.cpsg.org/vortex-more-detail>

- Used **VORTEX** for population modeling
- Set up standard 3-yr model of a stable bottlenose dolphin population without bycatch:
- Population size estimate from impacted Pilbara population
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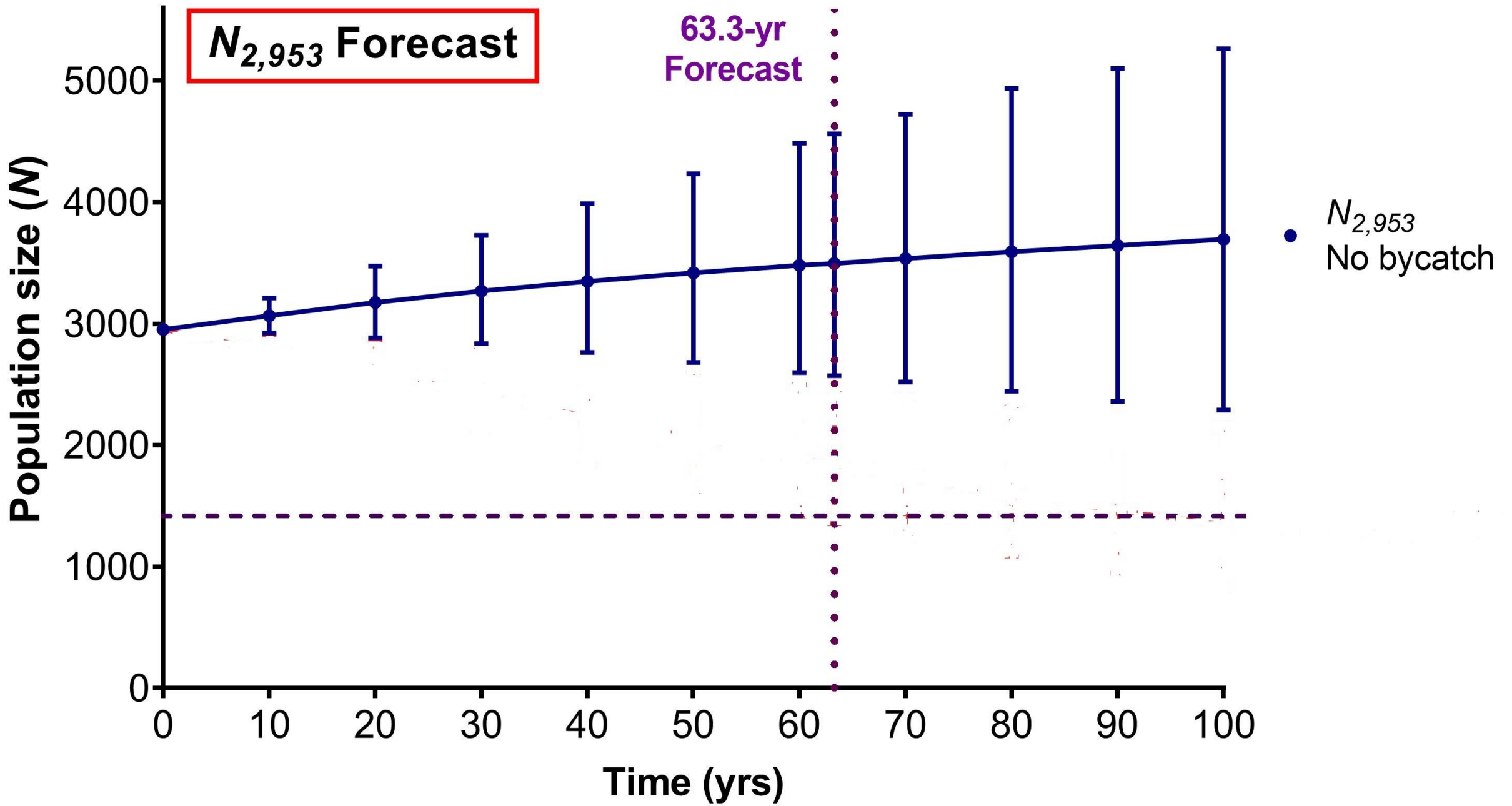
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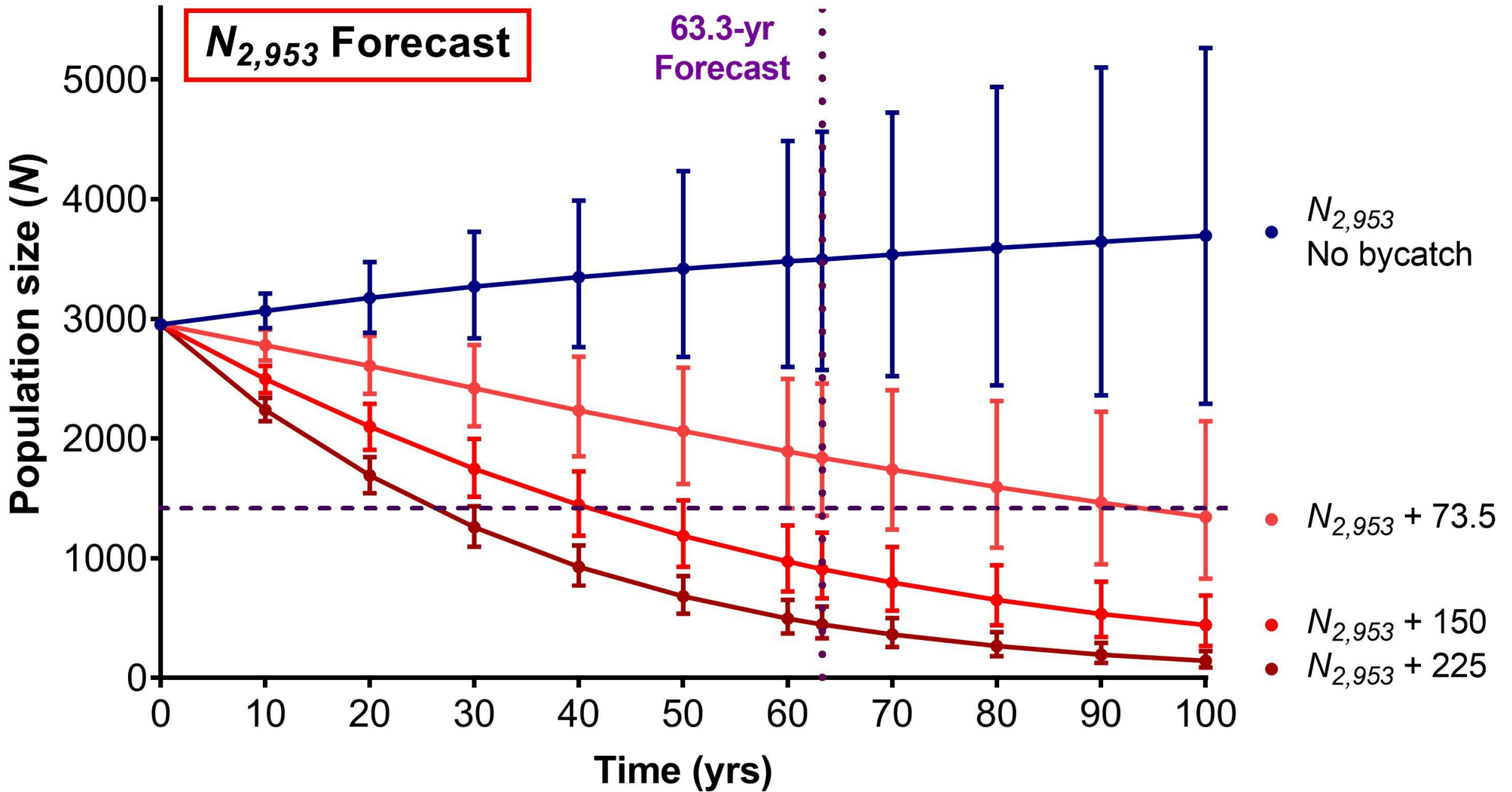


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Set up **bycatch scenarios** based on estimated & reported bycatch rates, PBR:

- **73.5/3-yr**
- **150/3-yr**
- **225/3-yr**
- **PBR: 48.57/3-yr (16.19/yr)**







**INTRODUCING *SAMSE*:  
SUSTAINABLE ANTHROPOGENIC MORTALITY IN  
STOCHASTIC ENVIRONMENTS**



# HOW DID WE APPLY SAMSE?

- Used **VORTEX** for population modeling to estimate **SAMSE** limit:
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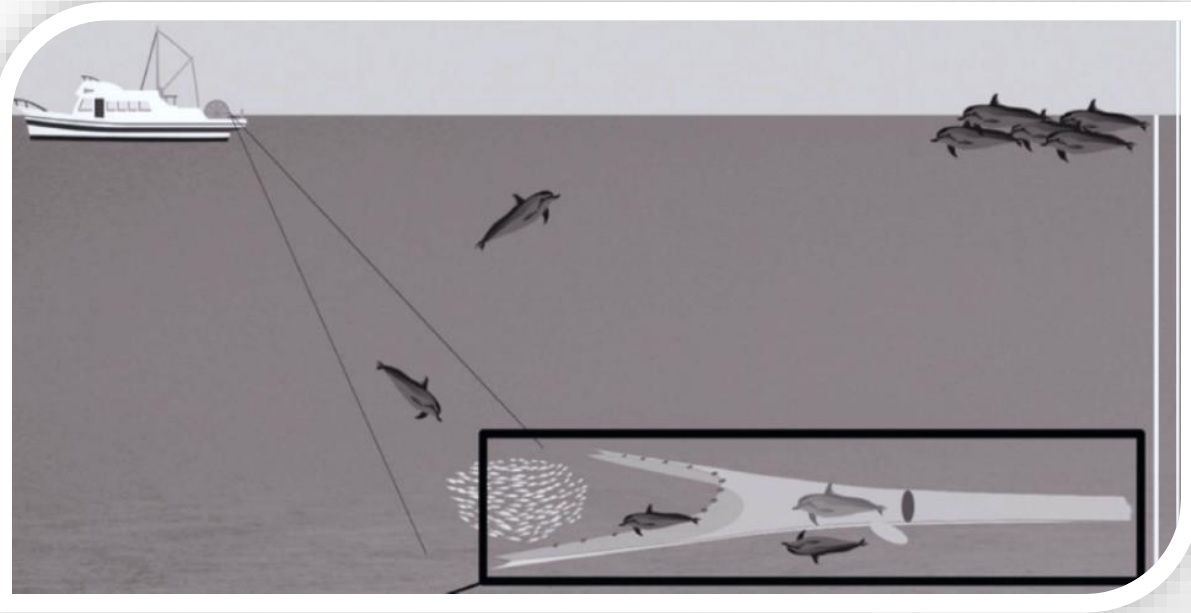
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  - **Environmental stochasticity**:  
Applied 3-yr standard deviations due to environmental variance ( $SD_{EV}$ ) for age-specific mortality rates and reproductive rates, as reported for stable population (Shark Bay)
- **Ran trial scenarios** that included the removal of a set number of individuals until we reached forecasts that produced non-negative stochastic growth rates, i.e. the **SAMSE limit**

# SAMSE RESULTS



$N_0$	<b>SAMSE</b>	$r_{det}$	$r_{stoch}$
1,619	<b>2.33</b>	0.0004	<b>0.0001</b>
2,953	<b>4.33</b>	0.0003	<b>0.0001</b>
5,473	<b>8</b>	0.0003	<b>0.0001</b>

$N_0$	<b>SAMSE +1</b>	$r_{det}$	$r_{stoch}$
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**SAMSE**  $\approx$  2-8 removals/year  
(7-24 per 3-yrs)



# PBR vs SAMSE

**PBR** (Wade,1998)

$$N_{MIN} (R_{MAX}/2) F_R$$

$$N_{MIN} = 1,619$$

$$R_{MAX} = 0.04 \text{ (default for cetaceans)}$$

$$F_R = 0.5 \text{ (Wade, 1998)}$$

THUS PBR =

$$1,619 \times (0.04/2) \times 0.5 = \underline{16.19}$$

**PBR\***  $\approx$  **16** removals/year  
(48-49 per 3-yrs)

**\*Potential Biological Removal**  
(conventional method without  
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**TO REACH OR MAINTAIN**  
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**POPULATION STABILITY IN STOCHASTIC ENVIRONMENT**

# SAMSE

## Impacted Population

Parameters may include:

- Abundance estimates
- Carrying capacity
- Fishery bycatch rates

## Stable Reference Population

Parameters may include:

- Mortality rates
- Reproductive rates
- Age class distribution

### (a) Demographic Stochasticity:

Emerges from simulated occurrence of events based on specified probabilities

### (b) Environmental Stochasticity:

Incorporate vital rate  $SD_{EV}$ :

$$SD_{EV} = \sqrt{\sigma^2_{Tot} - \sigma^2_{Samp}}$$

Use binomial (or beta) distributions to sample annual value from mean and  $SD_{EV}$

**Stochastic Model**  
Trials to determine **SAMSE**:  
Increase mortality until threshold of  $\pm r_{stoch}$  is reached

**SAMSE:**

$$r_{stoch} \geq 0$$

**SAMSE + 1:**

$$r_{stoch} < 0$$

## Steps to follow:

**1.) Setting up stochastic model** based on parameters from impacted population and stable reference population

## 2.) Incorporating stochasticity:

(a) **Demographic stochasticity**  
see diagram (a)

(b) **Env. stochasticity:**  
see diagram (b)

**3.) Trialing scenarios** that reduce mortalities until reaching the threshold (= SAMSE) at which one additional mortality would forecast a negative stochastic population growth

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# WHAT IS SAMSE?

- Sustainable **A**nthropogenic **M**ortality in **S**tochastic **E**nvironments
- **SAMSE** is a population modelling approach that incorporates stochasticity to estimate sustainable limits to human-caused mortality of wildlife (not only bycatch!)
- **SAMSE-limit**: The maximum number of individuals that can be removed by human activity, without resulting in negative stochastic growth rate forecasts
  - Removing one more individual per year would result in a population decline, i.e. a negative stochastic  $r$  ( $= SAMSE + 1$ )
- **SAMSE** allows us to incorporate stochasticity in the following ways:
  - Demographic stochasticity
  - Environmental stochasticity
  - Dependency of offspring on fate of parent(s) (e.g. dolphin calves that are dependent on mothers)

# ADVANTAGES & LIMITATIONS OF SAMSE

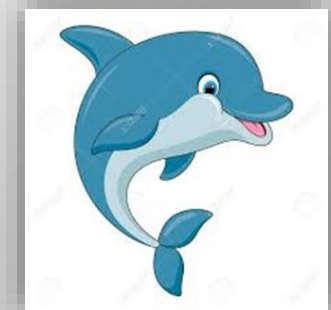
- **SAMSE** can incorporate **demographic stochasticity** & **environmental stochasticity**
- **SAMSE** can incorporate surrogate data from well-studied, stable reference populations, i.e. does not require lots of data from impacted population
- **SAMSE** is broadly applicable to a large range of taxa and situations (not only bycatch)
- **SAMSE** can be performed using various off-the-shelf modeling software that allows the incorporation of stochastic factors, e.g. **VORTEX\***, RAMAS



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- **SAMSE** can incorporate other threats (pollution, etc.); (akin to changing RMAX)
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## **\*PLAN:**

- Incorporate module into **VORTEX** to report **SAMSE-limit**
- Create “**library**” of pre-configured baseline **VORTEX** models for various species

# THANKS FOR YOUR INTEREST!

Oliver Manlik (UAEU), Robert C Lacy, William B Sherwin, Hugh Finn,  
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Conservation Biology



CONTRIBUTED PAPERS | Open Access |

## A stochastic model for estimating sustainable limits to wildlife mortality in a changing world

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First published: 04 February 2022 | <https://doi.org/10.1111/cobi.13897>

IUCN Conservation Planning Specialist Group, Species Conservation  
Toolkit Initiative SCTI: *SAMSE* to be incorporated into VORTEX

# THANKS FOR YOUR INTEREST!

Oliver Manlik (UAEU)

Opportunities for PhD at  
United Arab Emirates  
University:

- Population genomics  
fish (sardines, tuna)
- Gene expression in  
response to climate  
change (*Tigriopus*)

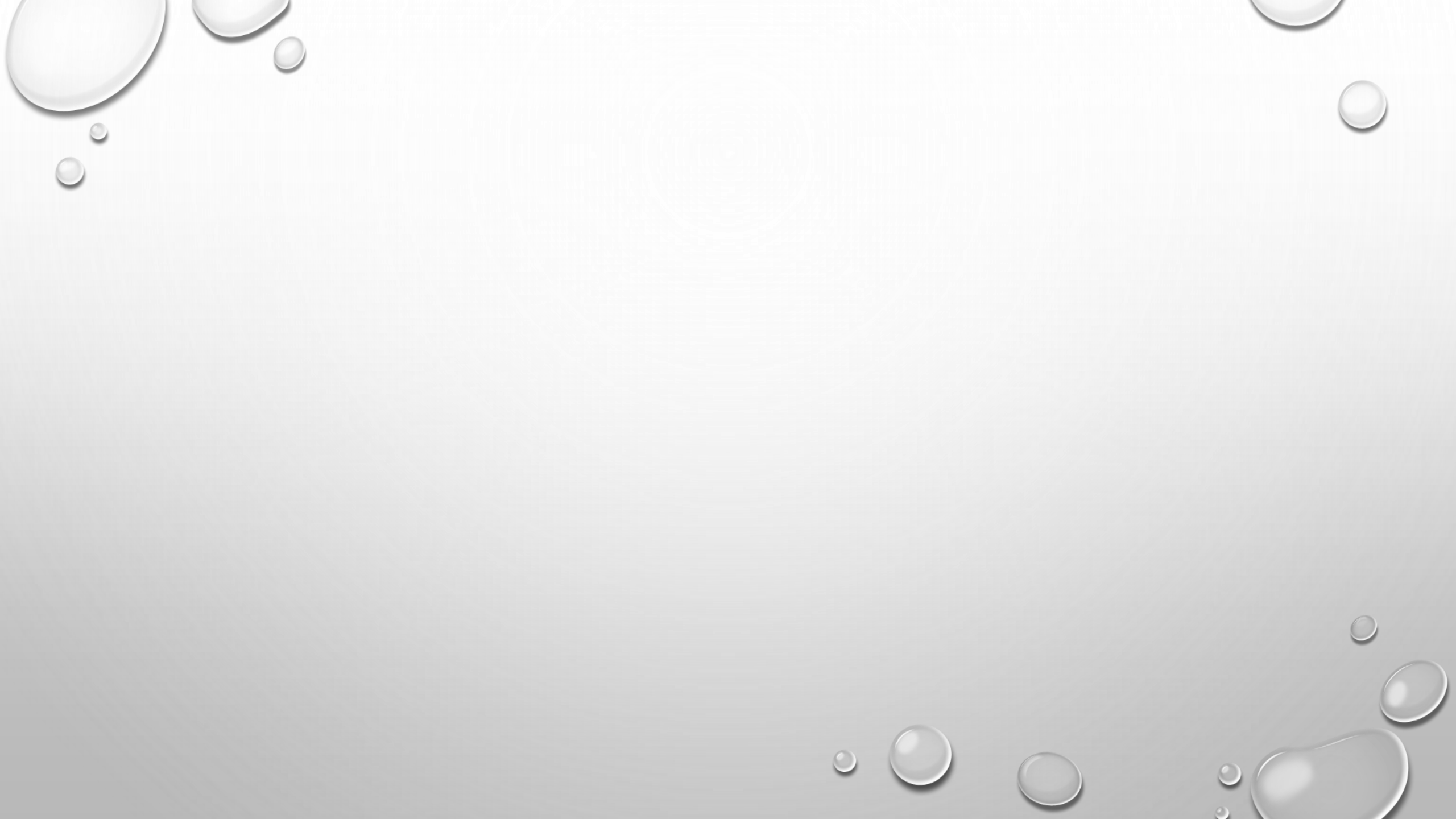
Contact me:

[oliver.manlik@uaeu.ac.ae](mailto:oliver.manlik@uaeu.ac.ae)

Twitter: [@Omanlik](https://twitter.com/Omanlik)







# WHAT IS EFFECT OF **STOCHASTICITY** ON FORECASTS?

	<b>With</b> Stochasticity	<b>With Env</b> Stochasticity	<b>NO</b> Stochasticity
Growth rate ( $r$ )	– 0.0233 to – 0.0972	– 0.0199 to – 0.0860	– 0.0196 to – 0.0832
% Change	<b>– 17% to – 23%</b>	<b>– 2% to – 7%</b>	NA

- Incorporating **stochasticity** substantially lowers population growth (by 17 to 23%), depending on population size
- **Large effect of demographic stochasticity**, in particular calf-mother dependency



# POTENTIAL BIOLOGICAL REMOVAL (PBR)

- **PBR** estimates maximum number of animals that may be removed from a “stock” while allowing that stock to reach or maintain its “optimum sustainable population”
- **PBR** is considered to provide a conservative limit for human-caused mortality
- **US Marine Mammal Protection Act** (MMPA, 1972) provides statutory framework for PBR concept

**PBR** (Wade, 1998):

$$N_{MIN} (R_{MAX}/2) F_R$$

$N_{MIN}$  = Min  $N$  estimate

$R_{MAX}$  = 0.04 (default for cetaceans)

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- Original equation/model is deterministic—i.e. does not incorporate stochasticity

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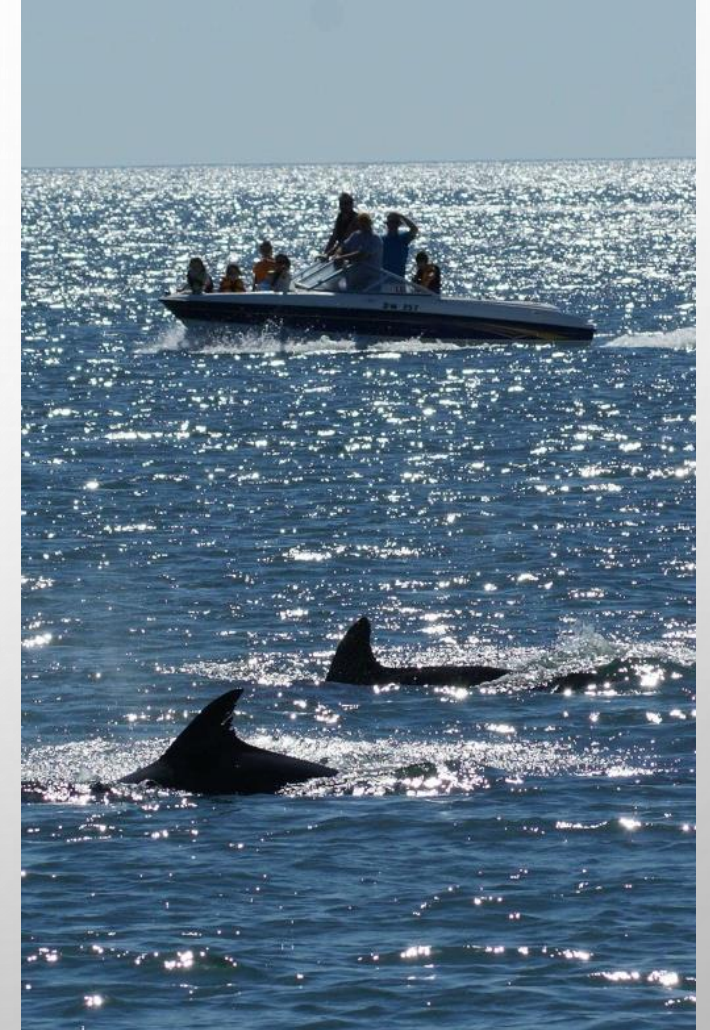
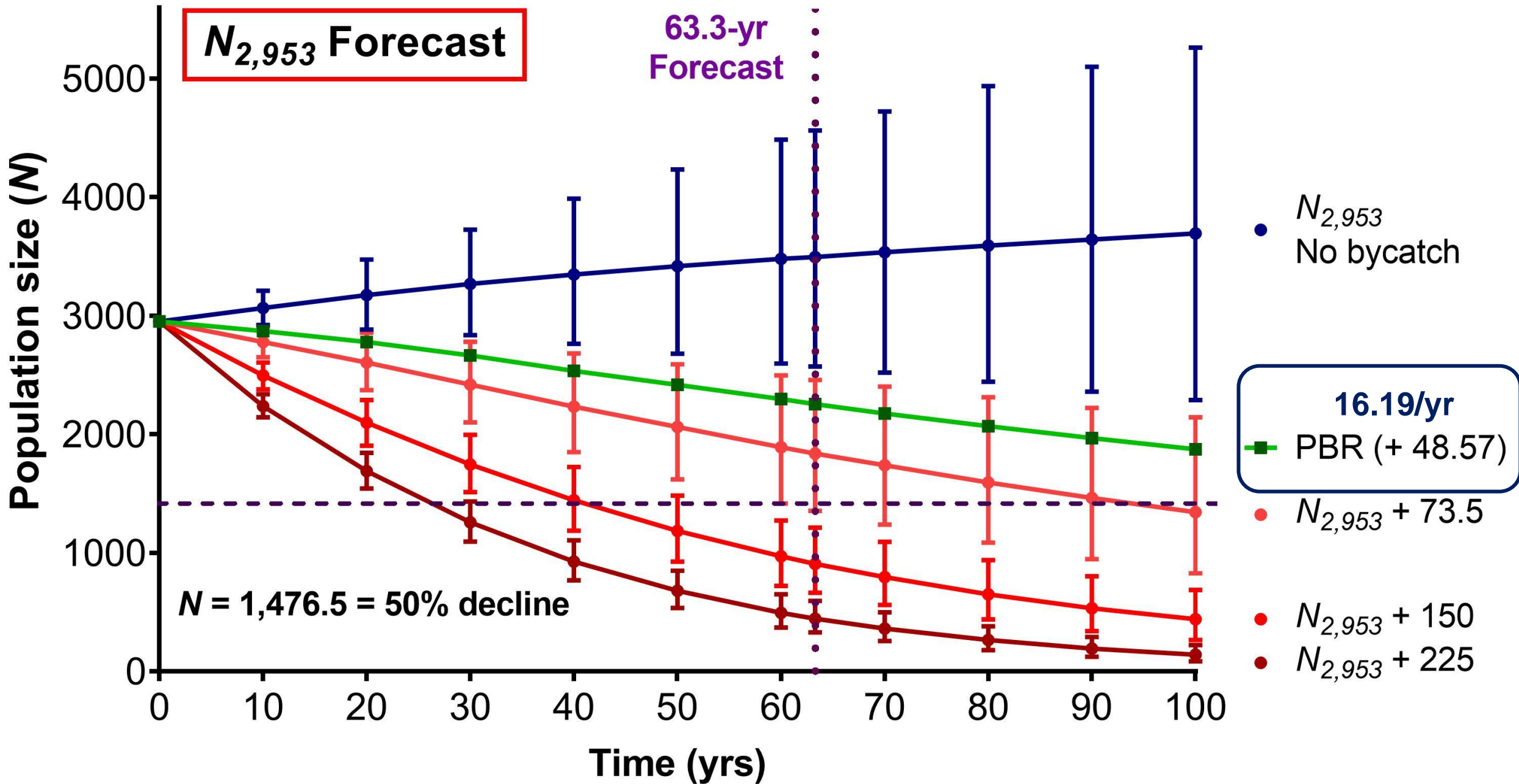


Photo: Claire Daniel





# POTENTIAL BIOLOGICAL REMOVAL (PBR)

**PBR** (Wade, 1998):

*“The model used is deterministic rather than stochastic...”*

*”it would be useful to **investigate the effects of stochastic dynamics** through simulations which incorporated plausible levels of environmental variance”*





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