



Where do we put
money, sex and politics?

MARRIAGE

No. of children = $\sqrt{\text{snoring} - \pi \times 2}$

Socks on floor

$3 \times \text{hair in sink} + \text{bad plumbing}^2$

< difficult in-laws

car trouble² = ironing² x pet²

$x^2 \sqrt{\text{smelly feet}}$

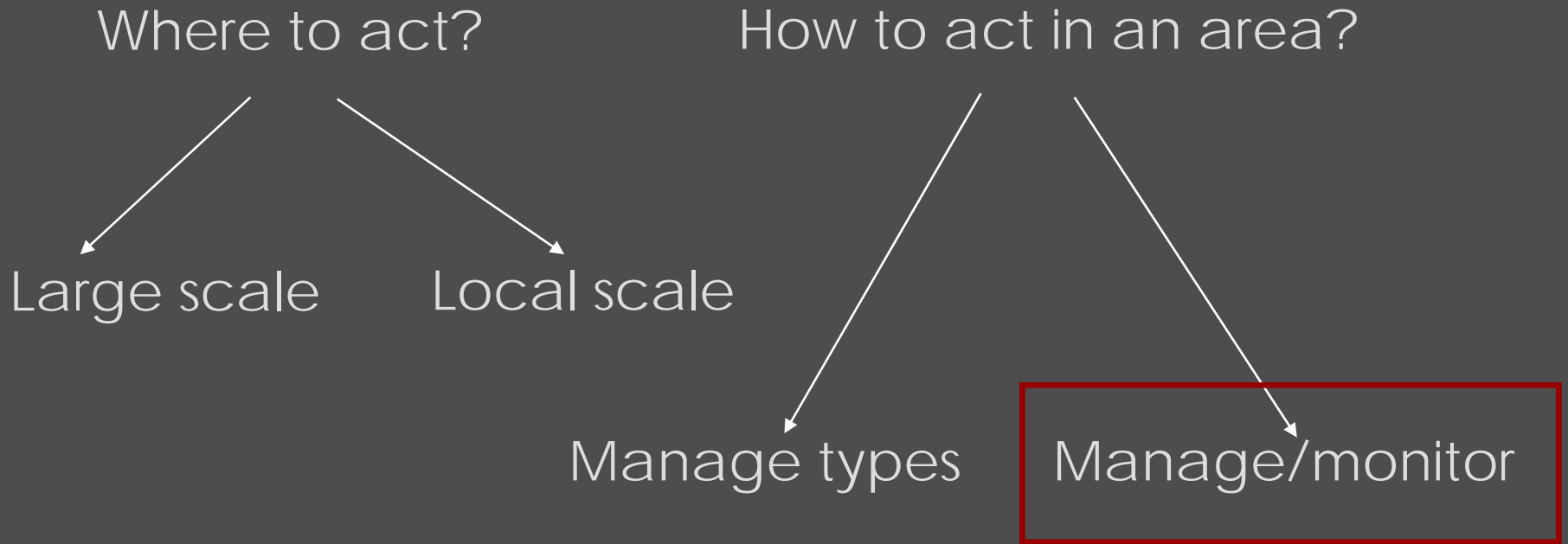
flower

> xy

y x crabgrass + unem

© Anne Gibbons

Suite of problems



Large scale – designing reserve networks

Gazetting of reserves key conservation action

Historical places in areas of low value

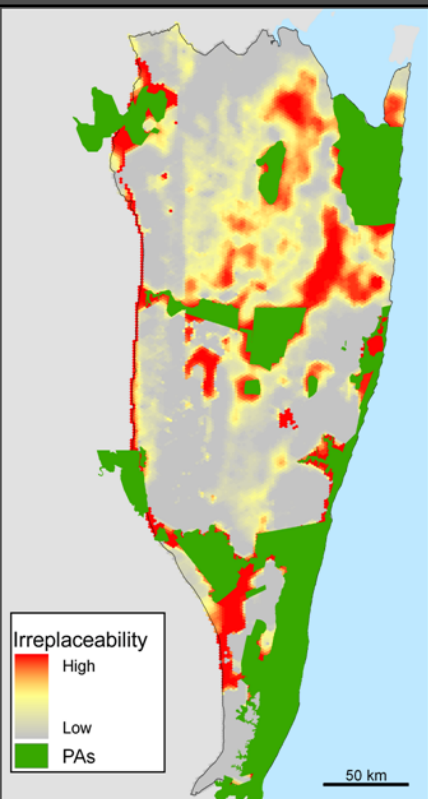
Where should we place reserve to attain certain features?



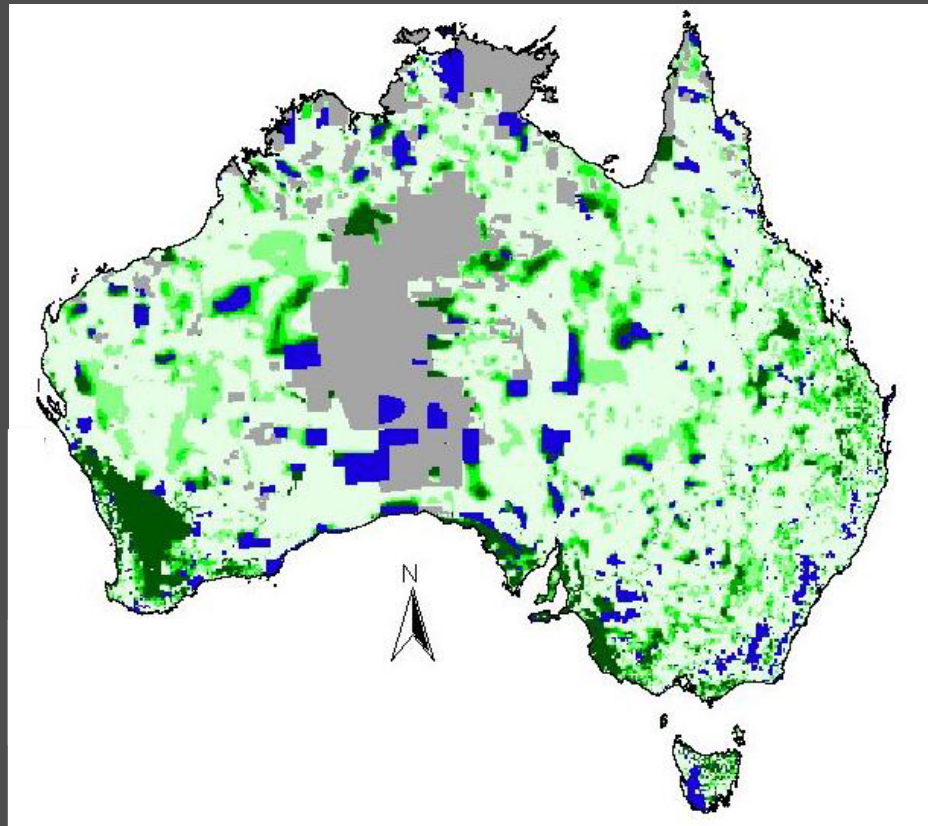
Knapsack problem – sim. annealing

A network that reaching targets for features for least cost.

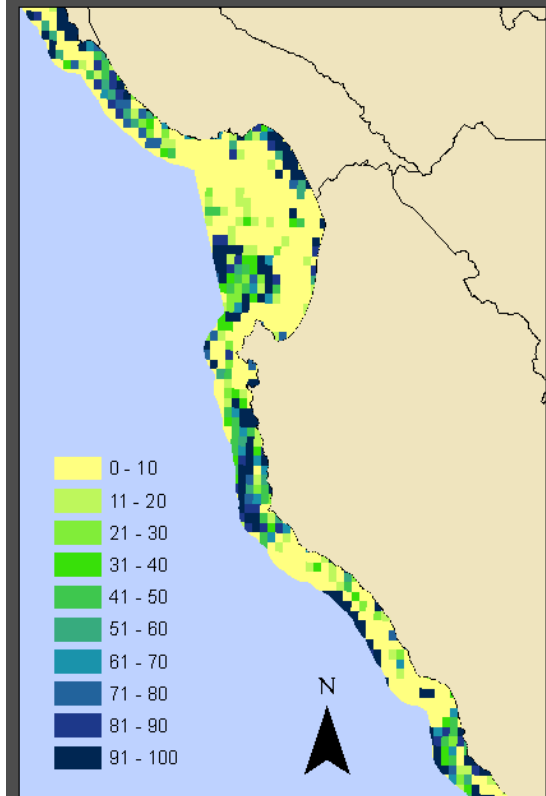
South Africa



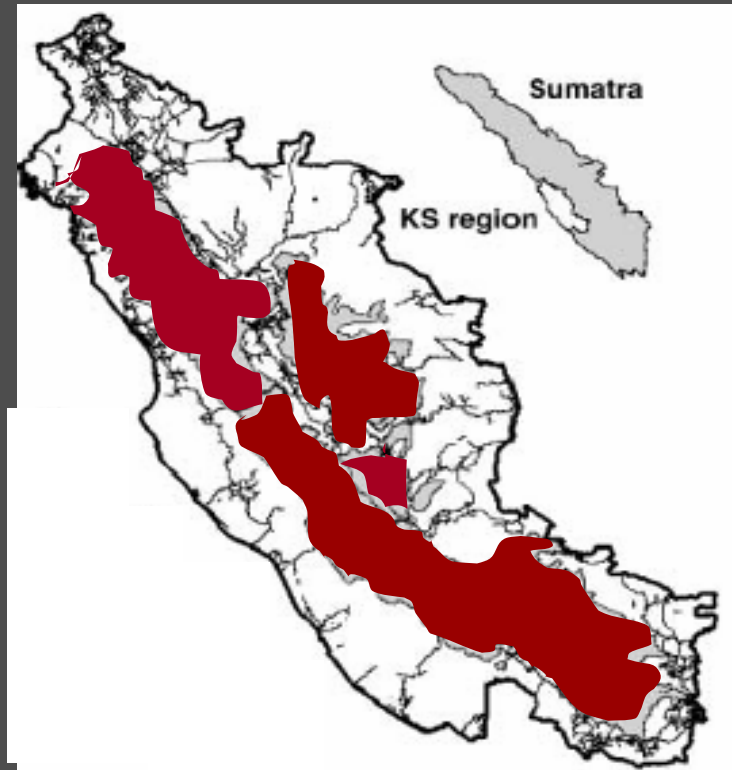
Obvious I hope



California



Local scale – managing th. species



Where/when to manage th. species?

Objective: maximise the number of extant population

Probability of extinction given investment (state transitions)

Stochastic dynamic programming for state-dep solution


$$NEP = (N_t - P_t) \cdot (B_t / N_t) + (N_t - N_t P_t)$$
$$N_t^* = (B_t / r_t) + (c_t / z_t)$$

$$M = r_t - r_0$$
$$(r_t - r_0) + (L_t - L_0)$$

What have we assumed?



What don't we know.....

system state

- what's in our reserve?
- is a species extant?

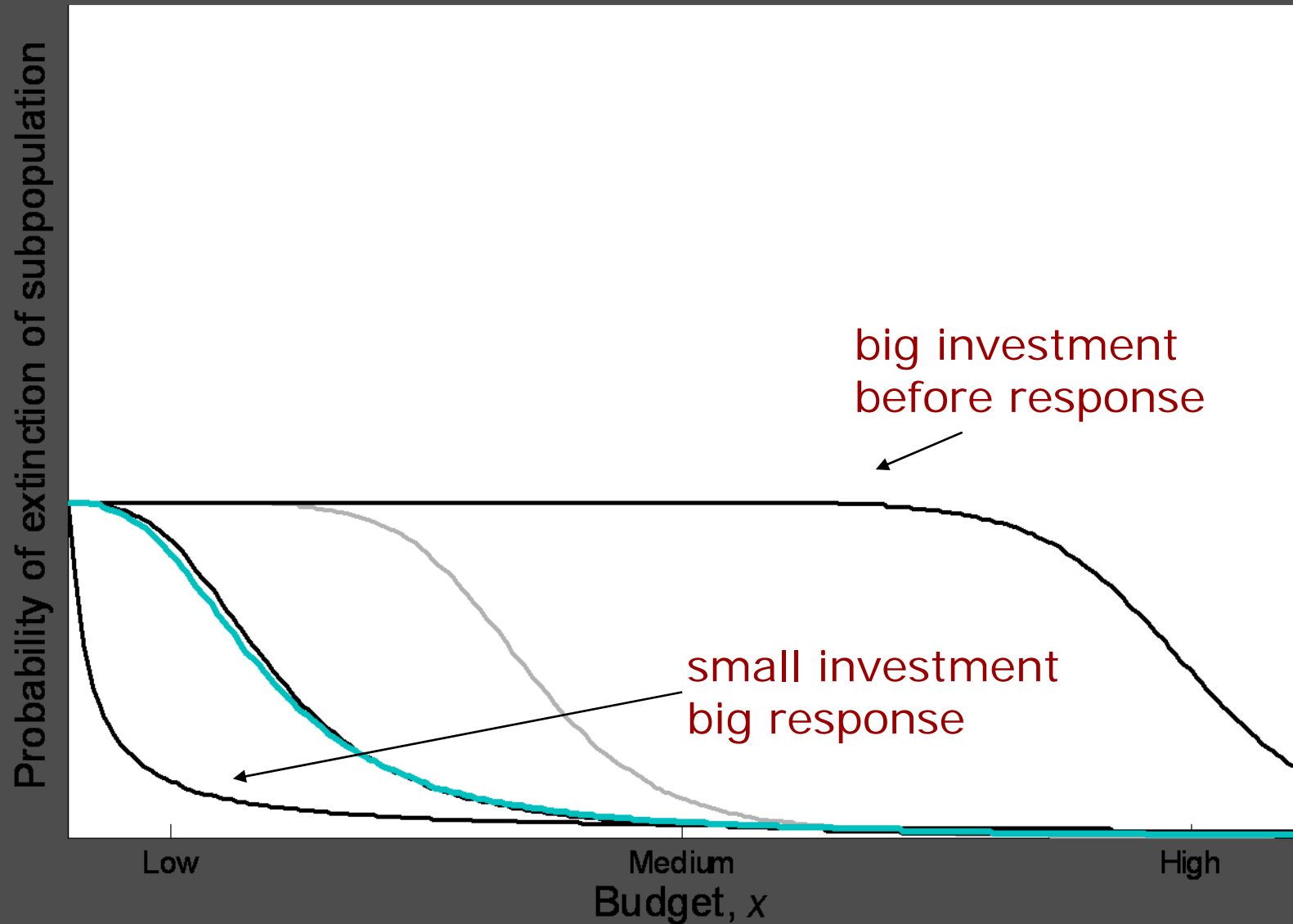
system model

- benefit | investment

the list goes on...



Uncertainty in functional form



Decisions in the face of uncertainty

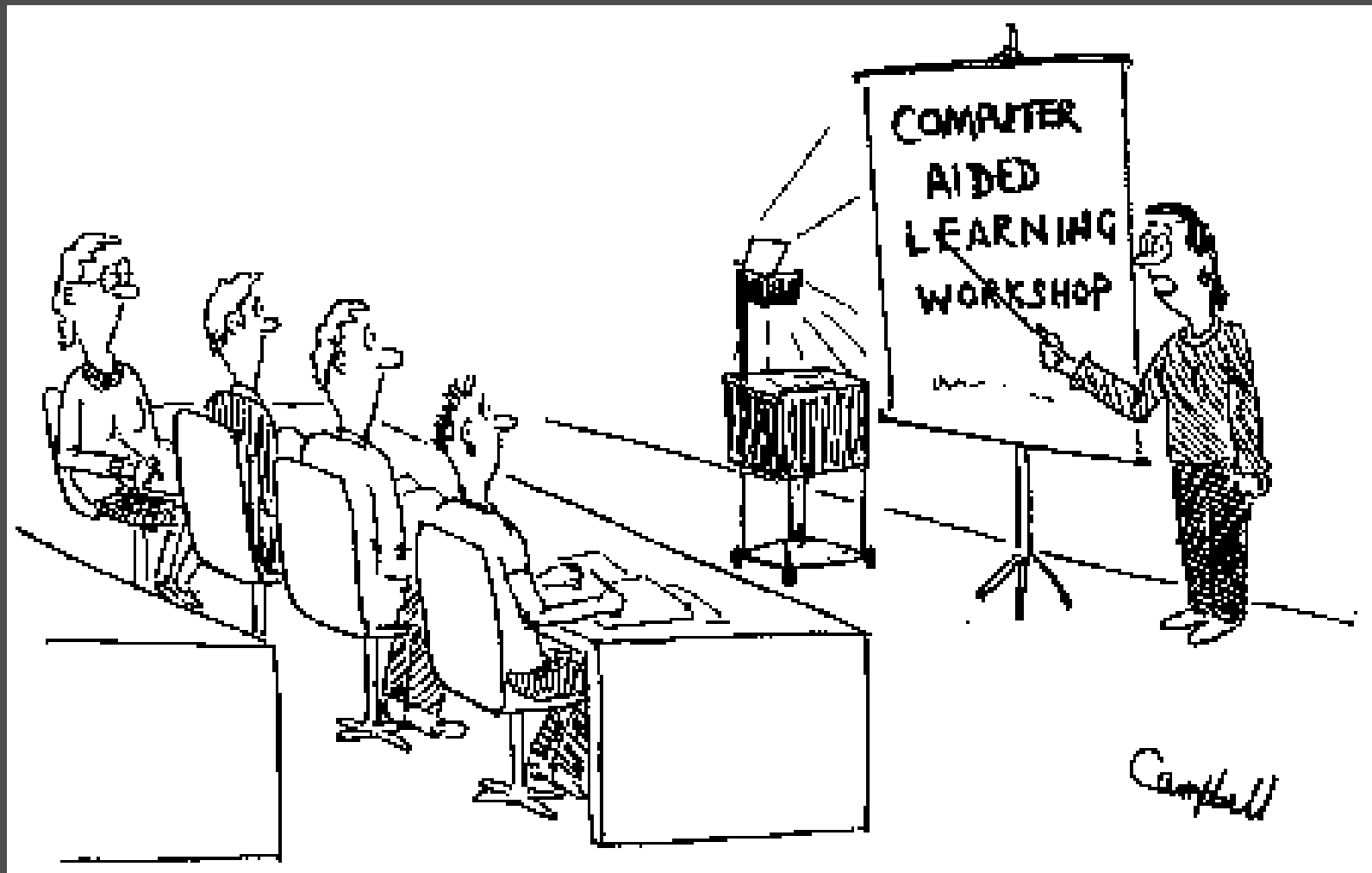
Uncertainty Analysis

- Sensitivity
- Maximin Theory
- Information Gap Theory



**"More decisive? How can I be more decisive?
- I live by the uncertainty principle!"**

From accept'ism to reductionism



Why monitor in conservation?

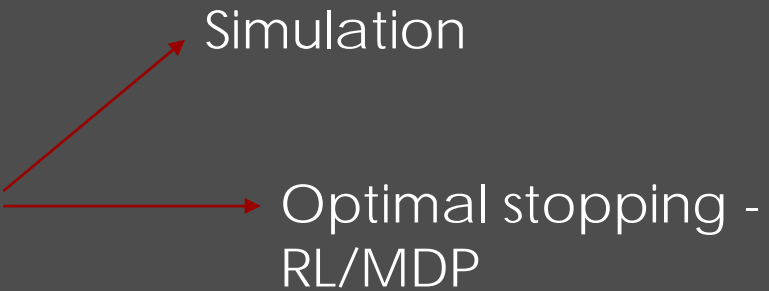
- Information gathering*
- Adaptive management
 - learning system state*
 - learning system model*



GET ALL THE
INFORMATION YOU CAN,
WE'LL THINK OF A
USE FOR IT LATER.

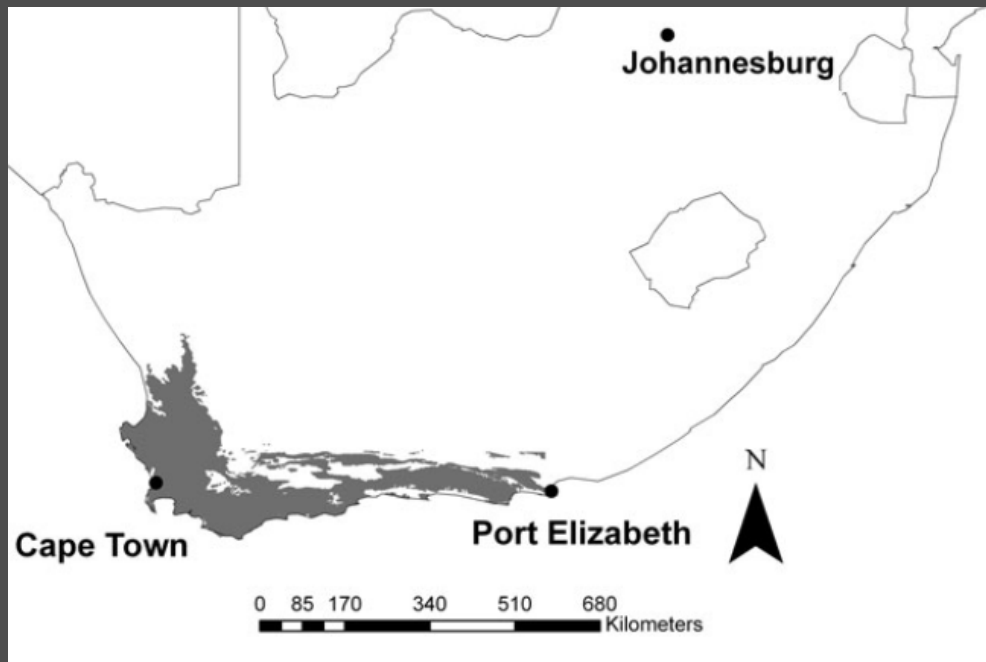


Why monitor in conservation?

- **Information gathering***
 - Adaptive management
 - learning system state*
 - learning system model*
- Simulation
- Optimal stopping - RL/MDP
- 

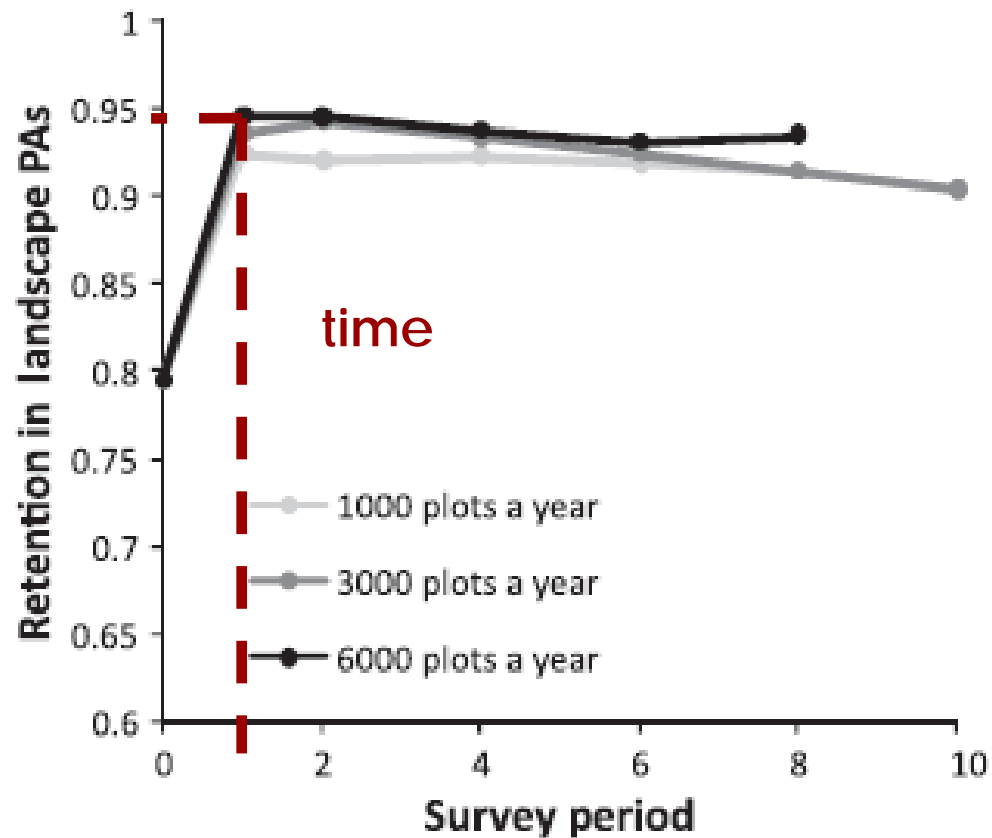
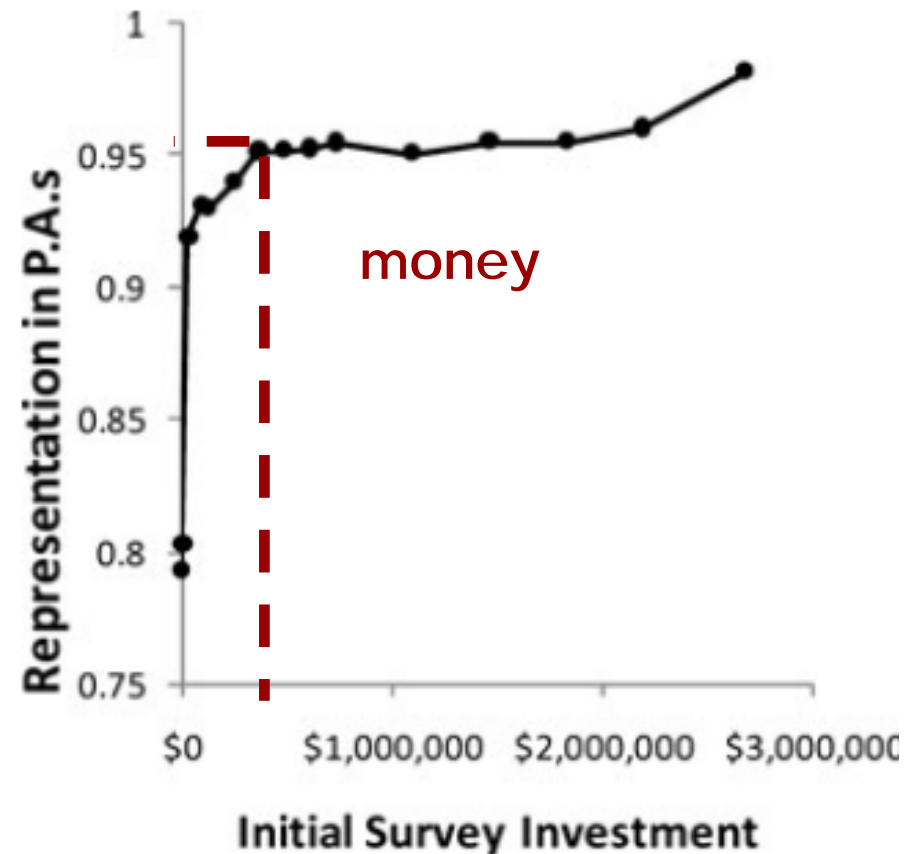


How much to learn
before designing
a reserve for proteas?

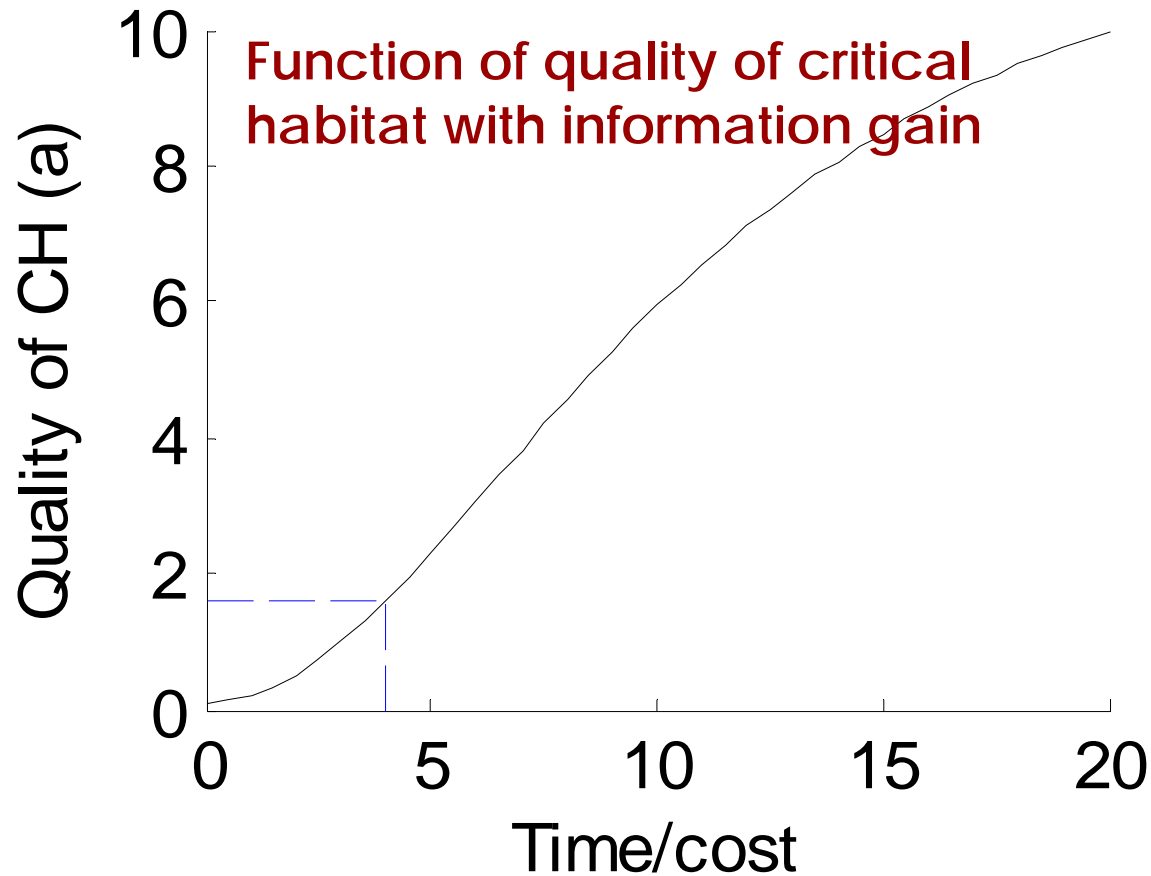


Simulation of reserve representation

with more/less info.



Designating critical habitat



What should we do?



Do nothing



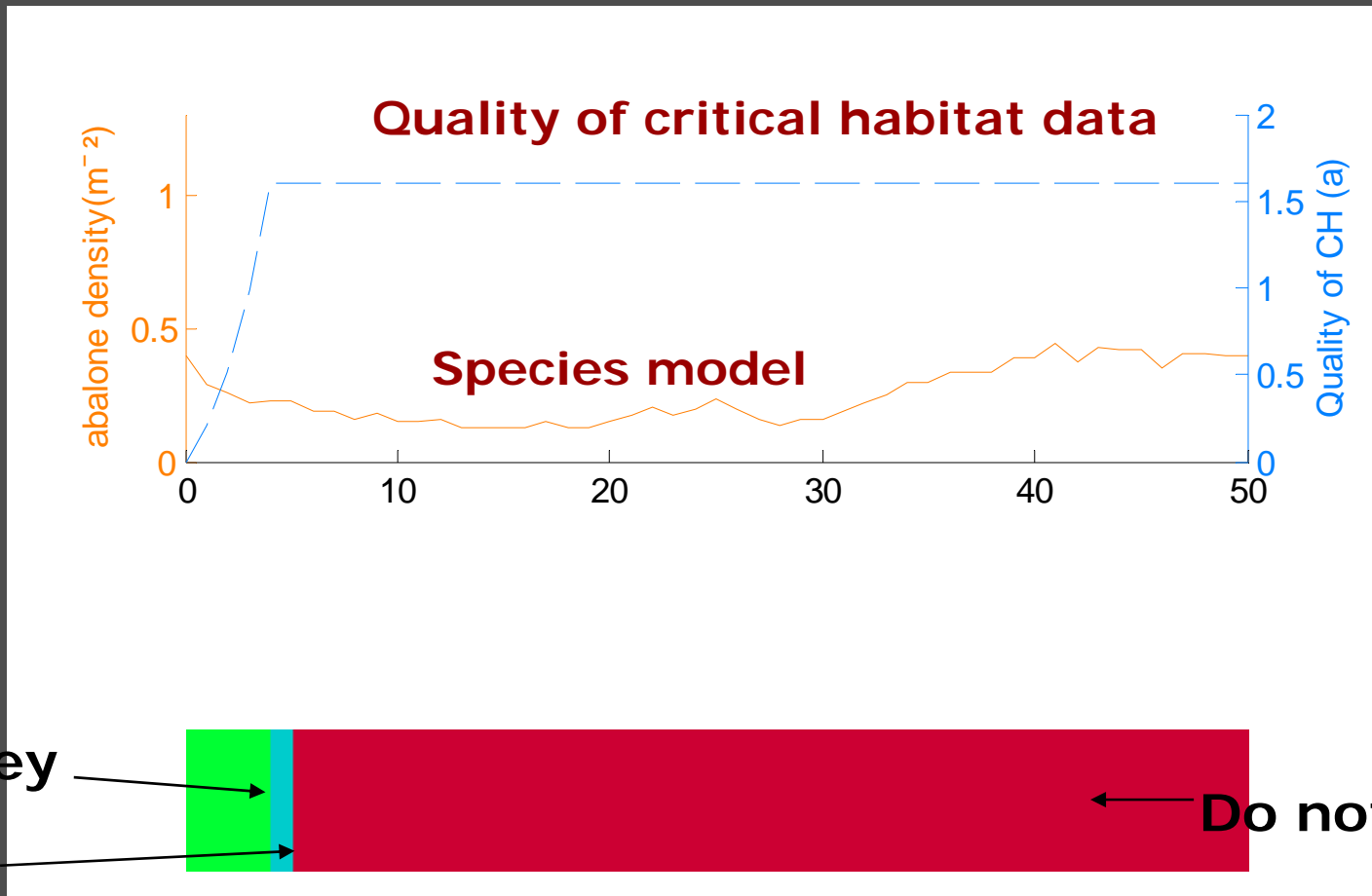
Survey and learn about
the critical habitat



Stop surveying & protect
what we think is CH

Optimal strategy given information & species models

Reinforcement Learning.



Why monitor in conservation?

- Information gathering*
- Adaptive management
 - **learning system state*** → POMDP
 - learning system model*



Acting based on belief.

If decision to patrol is based on state of system

- tigers extant or extinct

Uncertain about state

Save/Survey/Surrender question



80% sure?

Chades et al (2008) PNAS

POMDP

- Find best decision given our belief in 'real state'

"where I
think I am"



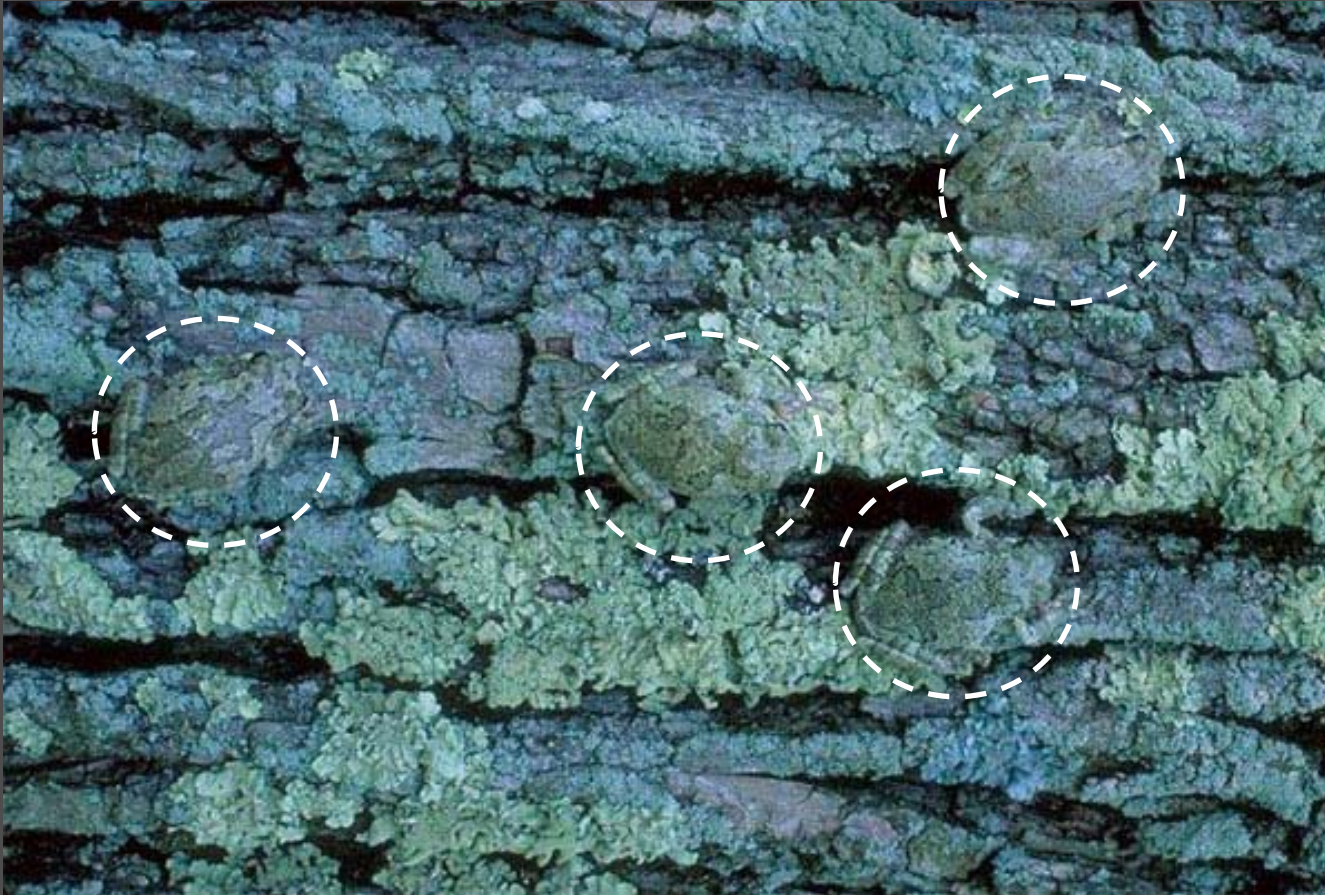
s_1 extant

$$b(s_1) = 0.75$$

s_2 extinct

$$b(s_2) = 1 - b(s_1) = 0.25$$

Incorporating surveying - detection



How many frogs can you find?

Relationship between states and observations

MDP

Observations

Observed

z_1 present

z_2 absent

1

1

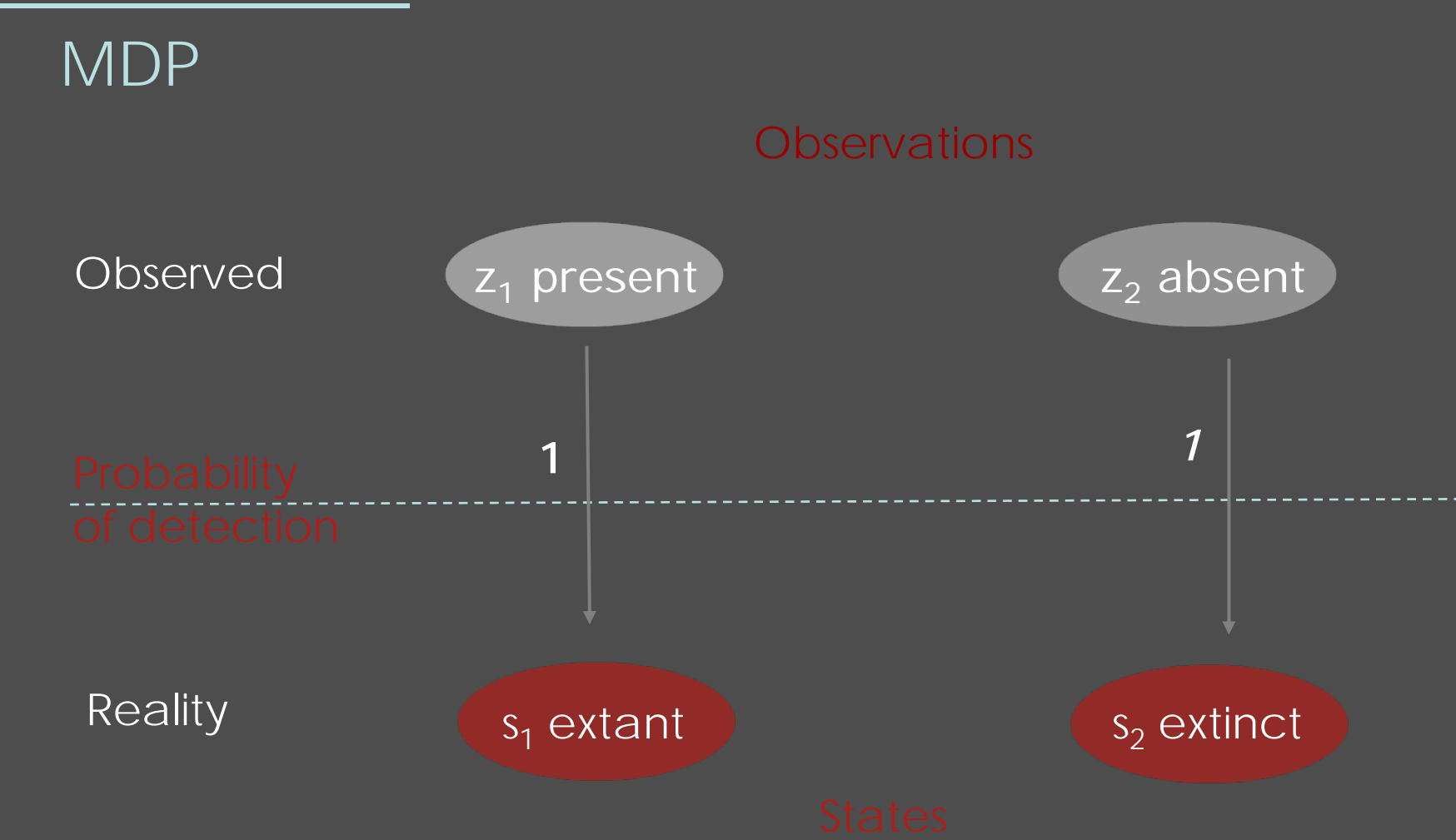
Probability
of detection

Reality

s_1 extant

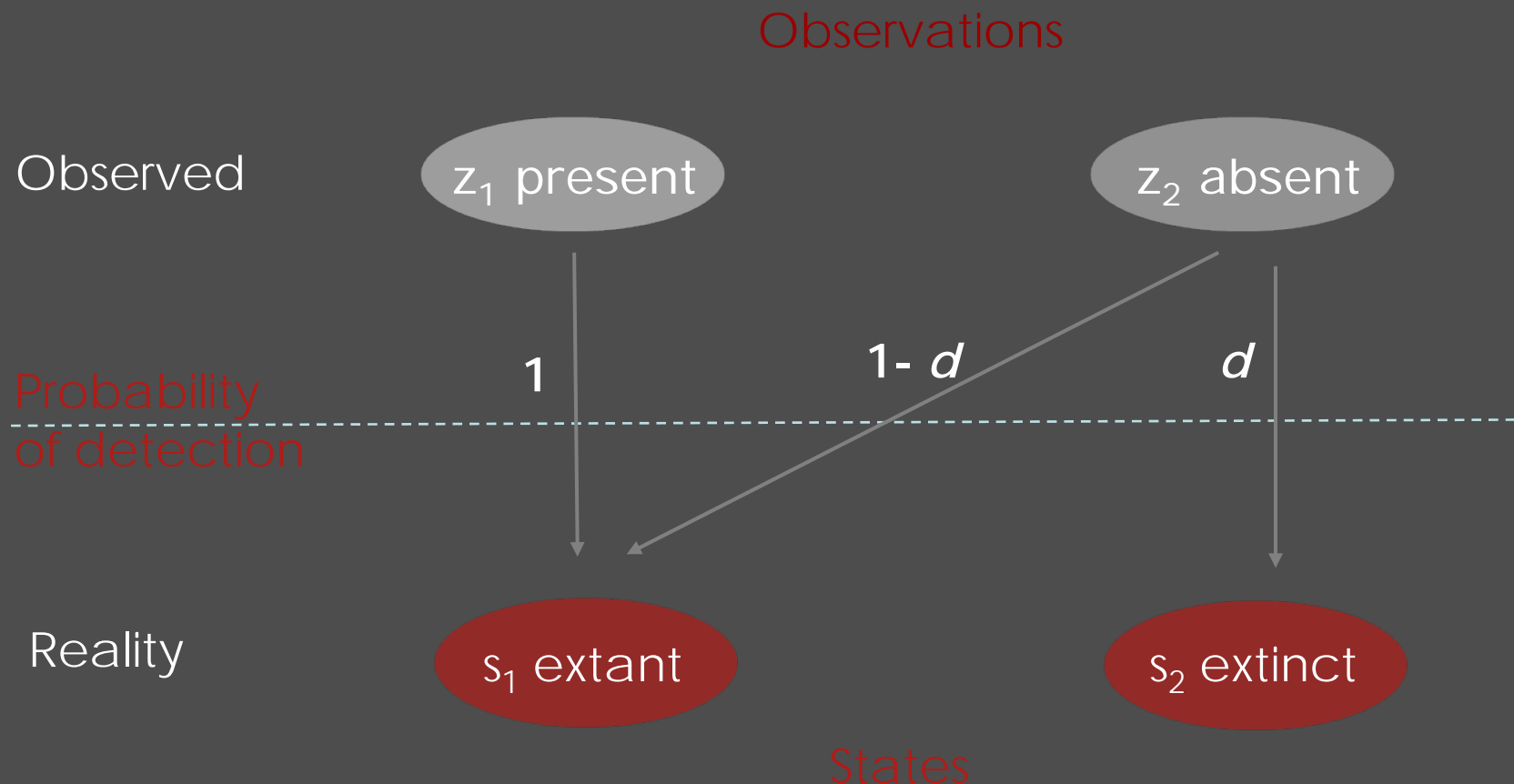
s_2 extinct

States



Relationship between states and observations

POMDP

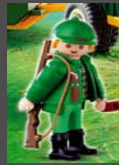


changing belief | decisions & observations

“where i think i was”

changing belief | decisions & observations

“where i think i was”



\$\$



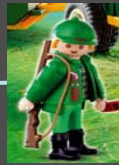
\$



0

changing belief | decisions & observations

"where i think i was"



\$\$



\$



0



detection

probabilities:

$$d_m = 0.01$$

$$d_s = 0.78$$



transition

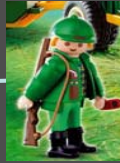
probabilities:

$$p_m = 0.05$$

$$p_o = 0.1$$

changing belief | decisions & observations

"where i think i was"

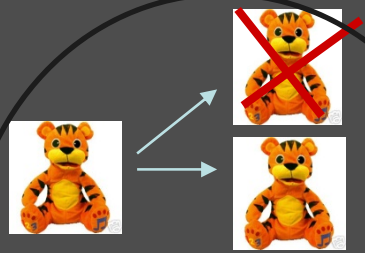


\$\$

\$

0

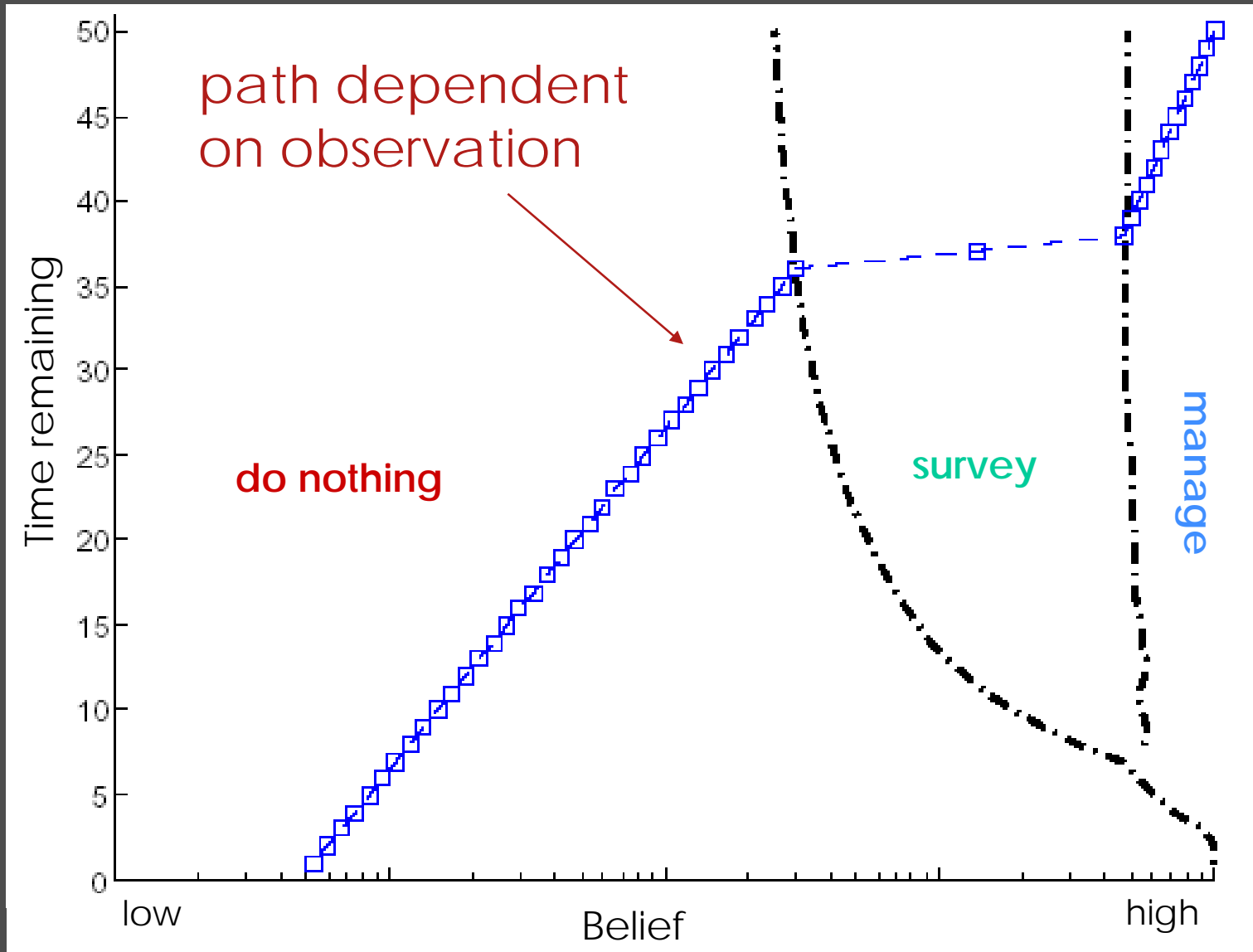

detection
probabilities:
 $d_m = 0.01$
 $d_s = 0.78$


transition
probabilities:
 $p_m = 0.05$
 $p_o = 0.1$

"where i think i am now"



Acting based on belief in presence



Why monitor in conservation?

- Information gathering*
- Adaptive management
 - learning system state*
 - **learning system model*** → Belief MDP



Adaptive management

Systematic approach to improving management via learning

Understood but mathematically difficult to assess


$$NEP = n(N - P(B, W)) + (N - W)P_0$$
$$n^* = B/(c(N + cW/zc))$$

$$m = n - r_0$$
$$(n - r_0) + (L - L_0)$$

Passive versus Active

**WARNING: the following slides
show images that may be
disturbing to some people!**

how can we actively learn system function?

- a devilishly difficult dilemma

Dramatic decline

Facial tumour disease

Urgent & expensive management

Disease behaviour unclear?



how can we actively learn system function?

- a devilishly difficult dilemma

Objective : Maximise pop growth

Decrease prevalence

Removal of individuals

2 sites for feasible learning



McDonald-Madden *et al* (2009)

A devilishly difficult dilemma - actions

Many facets unclear

Latency affects removal


Short – remove diseased

Long – remove all

Removal affects reproduction and prevalence



Models and Action

		model 1	model 2	model 3
		Disease will not progress	short latency	long latency
action 1	No treatment	1.20	0.9	0.9
action 2	Cull all diseased	1.05	1.15	0.95
action 3	Cull all adults	1.01	1.01	1.01

Monitoring

Information state for each model – belief that it is true

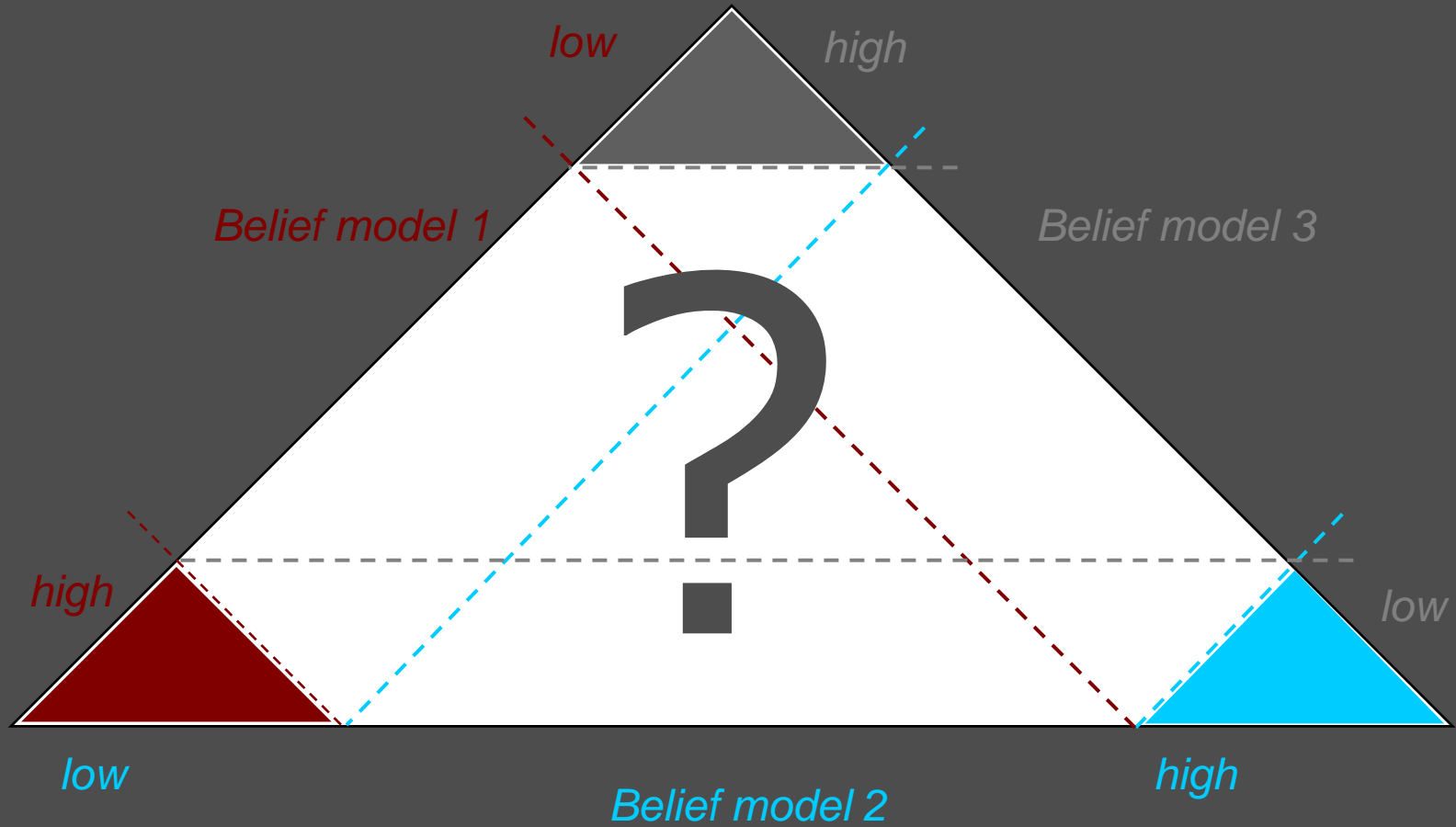
Outcomes assessed by monitoring

$$\lambda_{ijt}^s$$

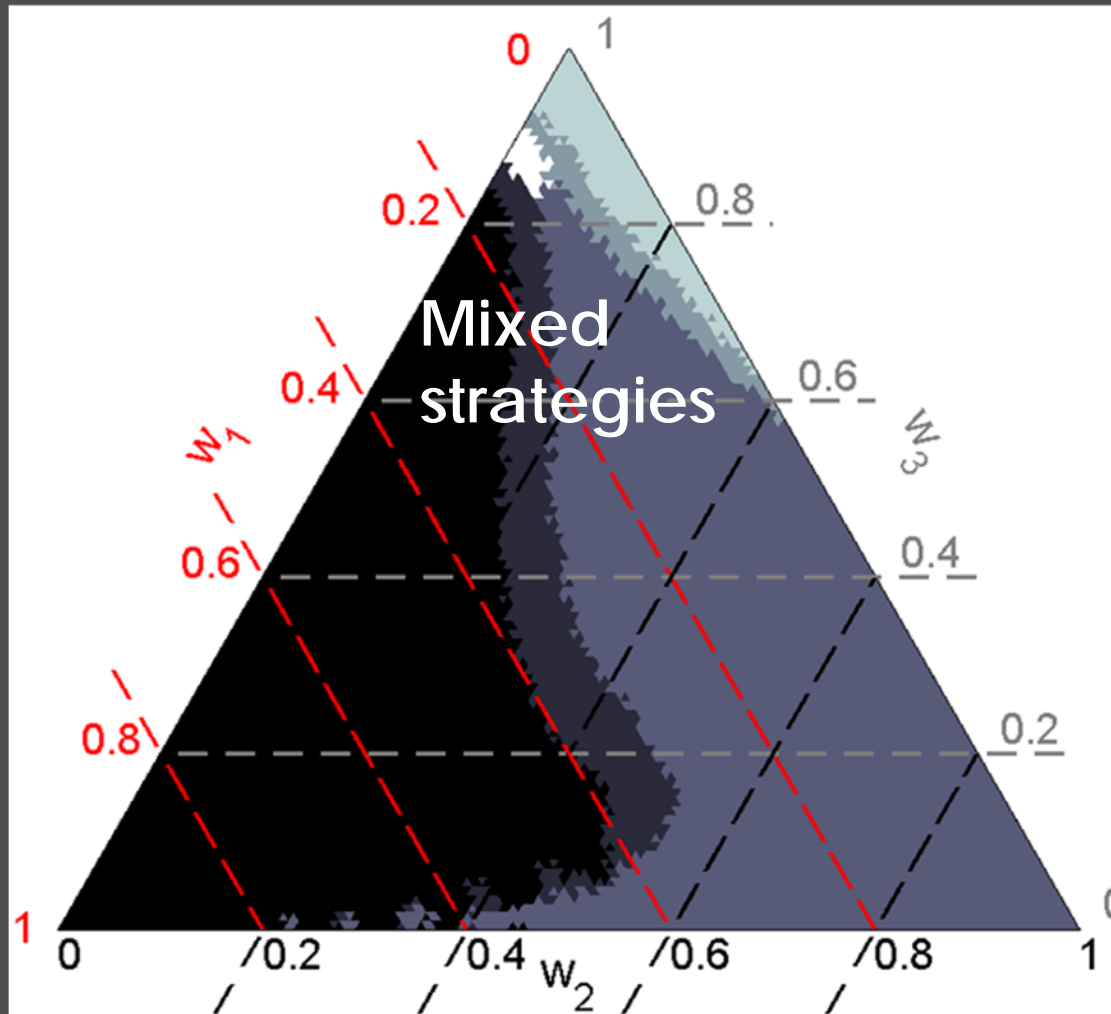
Reassess belief by Bayesian updating



High belief clear



Benefit based on learning and return



What we have to do....

Allocate money b/w areas

Allocate money b/w species

Allocate money b/w actions

Allocate money b/w info and management



Where to from here – more reality



"In the computer simulation he said he admired my candor and gave me a raise."

Where to from here.....

Getting around the curse of dimensionality

- dynamic reserve design
- species allocation on more complex system state



Where to from here.....

More model complexity

- spatial dispersal, multiple species and their interactions
- transitions unclear



Where to from here.....

Dealing with multiple competing objectives (multi-agent)

- social and biological (fisheries and reef conservation)

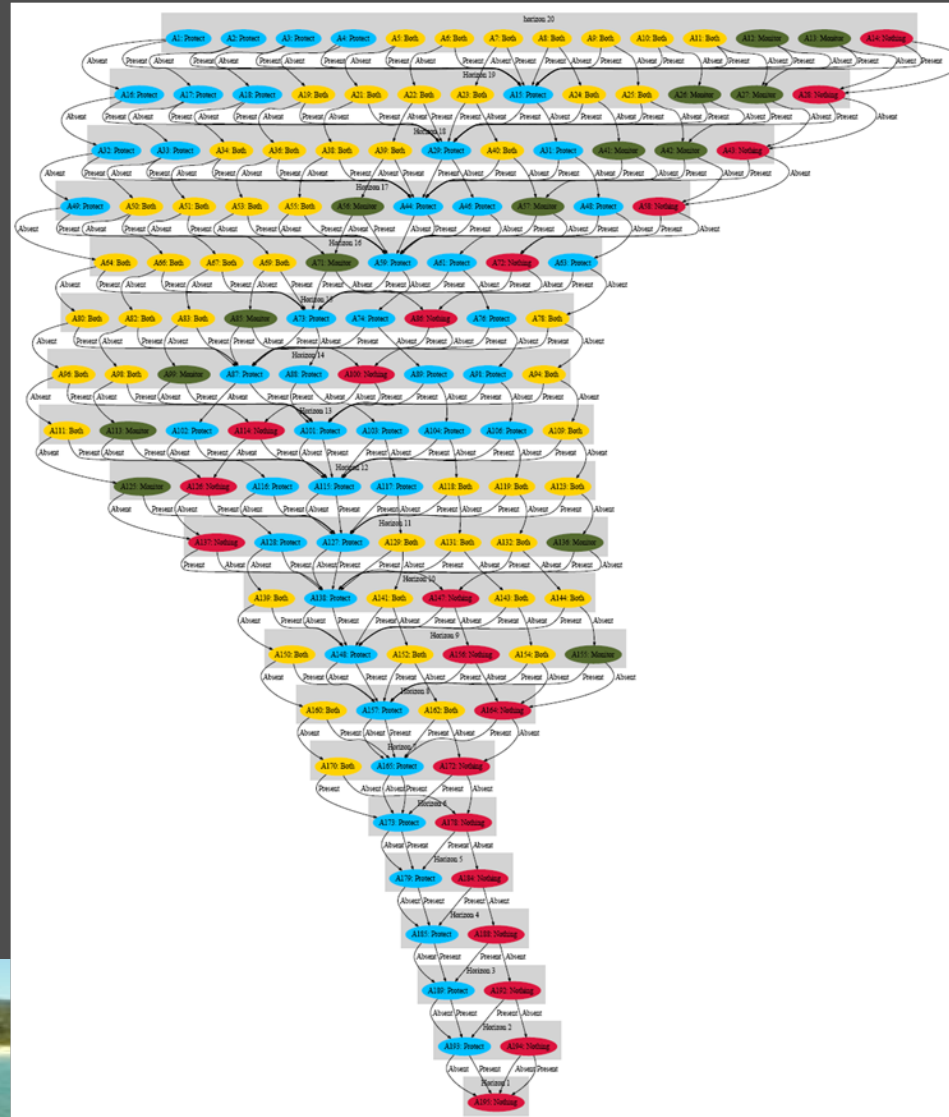

$$NEP = (N - P)(B/N) + (N - W)P_0$$
$$N^* = B/(r_1 + c_m/z_1)$$

$$M = r_1 - r_0$$
$$(r_1 - r_0) + (L_1 - L_0)$$

Where to from here.....

Even if we can optimize

- How to present
- How to use
- Rules of thumb



$NER = (N1 - P1) + (N2 - P2)$
 $N^* = P1 + (N1 - P1) + (N2 - P2)$

$(r1 - r0) + (L1 - L0)$



questions...