



# INFERRING ANIMAL SOCIAL NETWORKS WITH IMPERFECT DETECTION

Olivier Gimenez, Lorena Mansilla, Javier Klaich, Mariano Coscarella, Suzana Pedraza, Enrique Crespo



# SOCIAL NETWORK ANALYSIS (SNA)



Damien Farine



Hal Whitehead

« Social network analysis provides a flexible framework for analysing association or interaction data to address a broad set of biological questions (...). Most fundamentally, it provides a description of social structure. »

> Farine & Whitehead (2015) Journal of Animal Ecology 84, 1144-1163

# Behavioral ecology: Characterizing social structure

Behavioral Ecology (2019), XX(XX), 1-14. doi:10.1093/beheco/arz029

### **Original Article**

Assortative interactions revealed in a fission—fusion society of Australian humpback dolphins

Tim N. Hunt,<sup>1,®</sup> Simon J. Allen,<sup>2</sup> Lars Bejder,<sup>3,4</sup> and Guido J. Parra<sup>1</sup>

# Behavioral ecology: Characterizing social structure

Behavioral Ecology (2019), XX(XX), 1-14. doi:10.1093/beheco/arz029

### **Original Article**

Assortative interactions revealed in a fission fusion society of Australian humpback dolphins

Tim N. Hunt, 1,0 Simon J. Allen, 2 Lars Bejder, 3,4 and Guido J. Parra1

# Disease ecology: Planning vaccination campaigns

## **PROCEEDINGS B**

rspb.royalsocietypublishing.org

#### Research





Cite this article: Robinson SJ, Barbieri MM, Murphy S, Baker JD, Harting AL, Craft ME, Littnan CL. 2018 Model recommendations meet management reality: implementation

Model recommendations meet management reality: implementation and evaluation of a network-informed vaccination effort for endangered Hawaiian monk seals

Stacie J. Robinson<sup>1</sup>, Michelle M. Barbieri<sup>1</sup>, Samantha Murphy<sup>2</sup>, Jason D. Baker<sup>1</sup>, Albert L. Harting<sup>3</sup>, Meggan E. Craft<sup>4</sup> and Charles L. Littnan<sup>1</sup>

## Behavioral ecology: Characterizing social structure

Behavioral Ecology (2019), XX(XX), 1-14. doi:10.1093/beheco/arz029

### **Original Article**

Assortative interactions revealed in a fission fusion society of Australian humpback dolphins

Tim N. Hunt, 1,0 Simon J. Allen, 2 Lars Bejder, 3,4 and Guido J. Parra1

# Disease ecology: Planning vaccination campaigns

## **PROCEEDINGS B**

rspb.royalsocietypublishing.org

Research





Cite this article: Robinson SJ, Barbieri MM Murphy S, Baker JD, Harting AL, Craft ME, Littnan CL. 2018 Model recommendations meet management reality: implementation

Model recommendations meet management reality: implementation and evaluation of a network-informed vaccination effort for endangered Hawaiian monk seals

Stacie J. Robinson<sup>1</sup>, Michelle M. Barbieri<sup>1</sup>, Samantha Murphy<sup>2</sup>, Jason D. Baker<sup>1</sup>, Albert L. Harting<sup>3</sup>, Meggan E. Craft<sup>4</sup> and Charles L. Littnan<sup>1</sup>

# **Demography: Linking social structure and fitness**

# Role of sociality in the response of killer whales to an additive mortality event

Marine Busson<sup>a,1</sup>, Matthieu Authier<sup>b,c</sup>, Christophe Barbraud<sup>a</sup>, Paul Tixier<sup>d</sup>, Ryan R. Reisinger<sup>a,e</sup>, Anaïs Janc<sup>a</sup>, and Christophe Guineta

<sup>a</sup>Centre d'Etudes Biologiques de Chizé, UMR 7372, CNRS, La Rochelle Université, 79170 Villiers en Bois, France; <sup>b</sup>ADERA, 33600 Pessac, France; <sup>c</sup>Observatoire PELAGIS (CRMM), UMS 3462, CNRS-La Rochelle Université, 17000 La Rochelle, France; <sup>a</sup>School of Life and Environmental Sciences, Deakin University, Geelong, VIC 3125, Australia; and eCentre de Synthèse et d'Analyse sur la Biodiversité, Fondation pour la Recherche sur la Biodiversité (CESAB-FRB), Bâtiment Henri Poincaré, Domain du Petit Arbois, 13100 Aix-en-Provence, France





What if detection is imperfect?!

# And what you see...



Photo by H. Labach





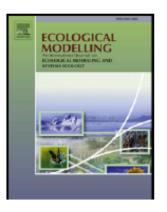
# SNA WITH CAPTURE-RECAPTURE DATA



Contents lists available at ScienceDirect

# **Ecological Modelling**

journal homepage: www.elsevier.com/locate/ecolmodel



# Inferring animal social networks with imperfect detection



Olivier Gimenez<sup>a,\*</sup>, Lorena Mansilla<sup>a</sup>, M. Javier Klaich<sup>b</sup>, Mariano A. Coscarella<sup>b,c</sup>, Susana N. Pedraza<sup>c</sup>, Enrique A. Crespo<sup>b,c</sup>

#### ARTICLE INFO

#### ABSTRACT

Keywords:
Bayesian inference
Capture-recapture
Multistate models
Social networks

Social network analysis provides a powerful tool for understanding social organisation of animals. However, in free-ranging populations, it is almost impossible to monitor exhaustively the individuals of a population and to track their associations. Ignoring the issue of imperfect and possibly heterogeneous individual detection can lead to substantial bias in standard network measures. Here, we develop capture-recapture models to analyse network data while accounting for imperfect and heterogeneous detection. We carry out a simulation study to validate our approach. In addition, we show how the visualisation of networks and the calculation of standard metrics can account for detection probabilities. The method is illustrated with data from a population of Commerson's dolphin (*Cephalorhynchus commersonii*) in Patagonia Argentina. Our approach provides a step towards a general statistical framework for the analysis of social networks of wild animal populations.

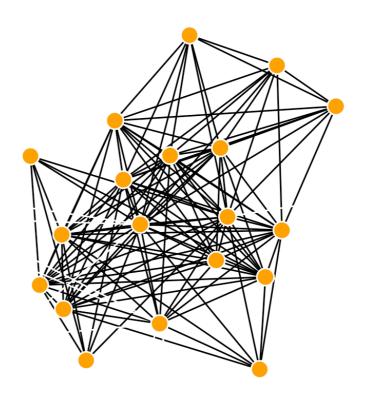
a CEFE, CNRS, Univ Montpellier, Univ Paul Valéry Montpellier 3, EPHE, IRD, Montpellier, France

<sup>&</sup>lt;sup>b</sup> Facultad de Ciencias Naturales y de la Salud, Universidad Nacional de la Patagonia San Juan Bosco, Blvd. Brown 3051, 9120, Puerto Madryn, Chubut, Argentina

<sup>&</sup>lt;sup>c</sup> Laboratorio de Mamíferos Marinos, CESIMAR, CONICET, Blvd. Brown 2915, 9120 Puerto Madryn, Chubut, Argentina

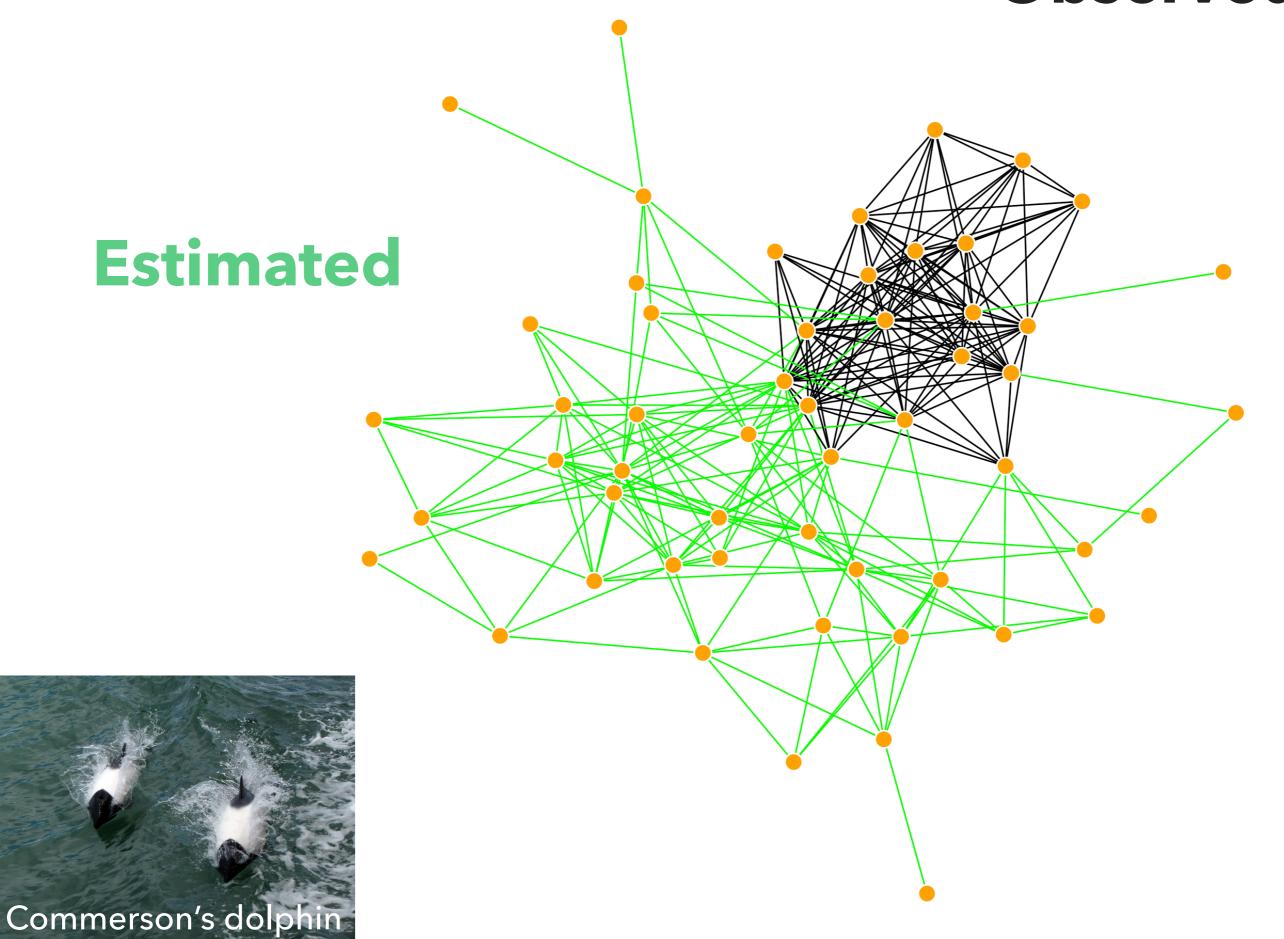
# CASE STUDY ON COMMERSON'S DOLPHINS

# Observed



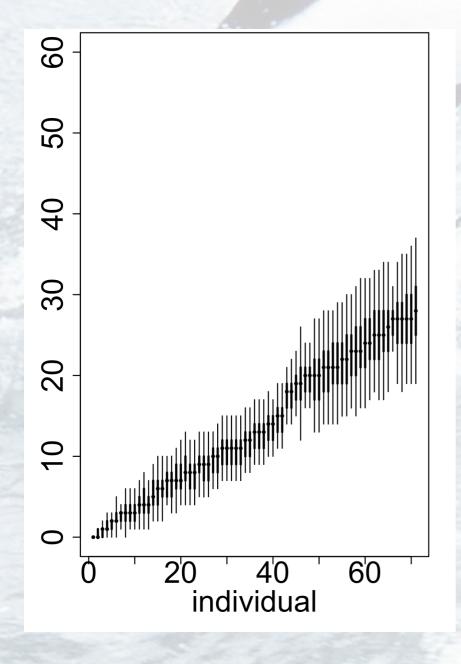


# Observed

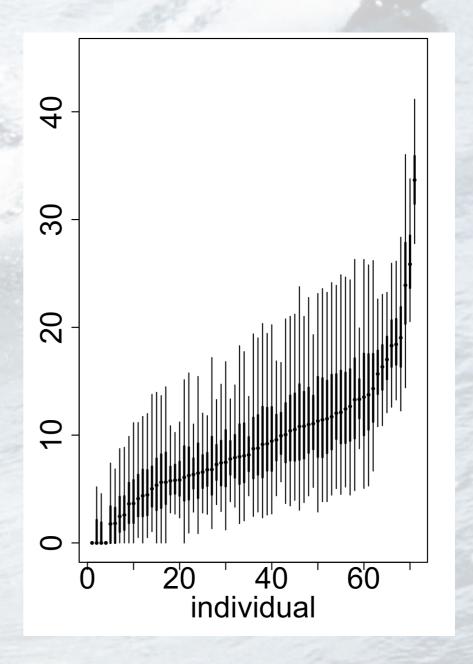


# Network characteristics with uncertainty

Number of links (degree)



Influential nodes (betweeness)







# INFERRING ANIMAL SOCIAL NETWORKS WITH IMPERFECT DETECTION

Olivier Gimenez, Lorena Mansilla, Javier Klaich, Mariano Coscarella, Suzana Pedraza, Enrique Crespo

