

# Predicción de reservorios y vectores y sus interacciones usando redes complejas

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C3 – Centro de Ciencias de la Complejidad y

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Simposio Ecología de enfermedades en vida silvestre

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- 3.- M. en C. Raúl Sierra Alcocer
- 4.- M. en C. Constantino González Salazar

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- 6.- Dr. Ángel Rodríguez Moreno
- 7.- Dr. José Juan Flores Martínez
- 8.- Dr. Gabriel Granados Gutiérrez
- 9.- Dra. Camila González Rosas (Universidad de los Andes, Columbia)
- 10.- Dr. Carlos Napoleón Ibarra Cerdeña (INSP, Tapachula)
- 11.- Est. Biól. Ruth Areli Gómez Rodríguez
- 12.- Est. Biól. María Azucena Trinidad Flores

# Who are we?

## Grupo del laboratorio de inmunoparasitología del Departamento de Medicina Experimental de la Facultad de Medicina en la UNAM.

13.- Dra. Ingeborg Becker

14.- Dra. Miriam Berzunza Cruz

15.- QFB. Dulce Jocelyn Bailón Martínez

16.- M. en C. Cristina Cañedo Guzmán

## El Centro Regional de Investigación del Instituto Nacional de Salud Pública (Tapachula, Chis.)

17.- Dra. Janine M. Ramsey Willoquet

18.- Dr. Carlos Félix Marina Fernández

19.- Dra. Teresa Ordoñez

20.- Keynes De la Cruz Félix

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21.- Dr. Mircea Gabriel Hidalgo Mihart

22.- Dra. Cristina Domingo Balcells

**Grupo de Monterrey: Laboratorio de Entomología médica, Depto. de Zoología de Invertebrados. Facultad de Ciencias Biológicas, Universidad Autónoma de Nuevo León**

23.- Dr. Eduardo A. Rebollar Téllez

24.- Estudiante Jorge Jesús Rodríguez Rosas

**Grupo de Jalisco: Centro Universitario de la Costa Sur. Universidad de Guadalajara.**

25.- Dr. Luis Ignacio Iñiguez Dávalos

26.- Biól. Pilar Ibarra

27.- Biól. María Magdalena Ramírez Martínez

# The Complexity of Disease and the Need for Transdisciplinarity

From the micro to the macro and back again

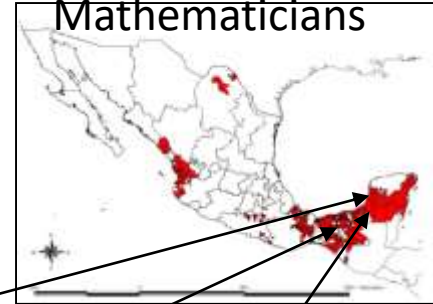
Sociologists  
Anthropologists  
Economists



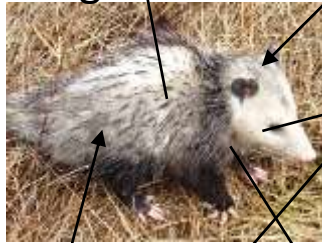
Inmunologists  
Geneticists  
Parasitologists



Geographers  
Epidemiologists  
Mathematicians



Ecologists

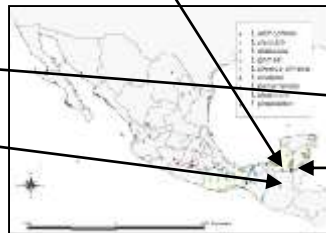


Medics

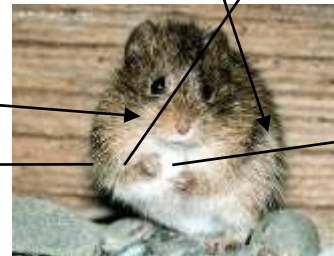


Biochemists  
Biophysicists  
Medics

Entomologists



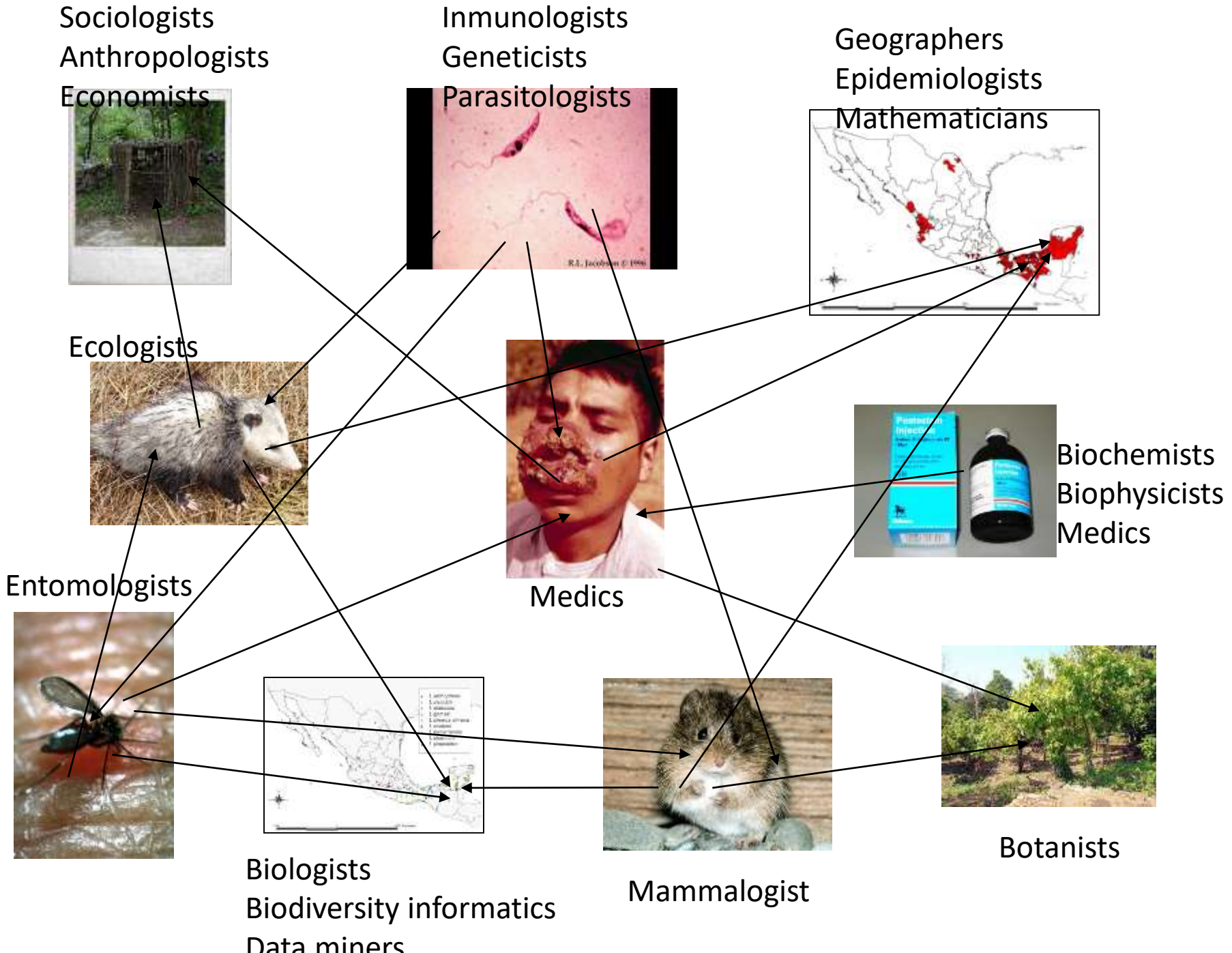
Biologists  
Biodiversity informatics  
Data miners



Mammalogist



Botanists

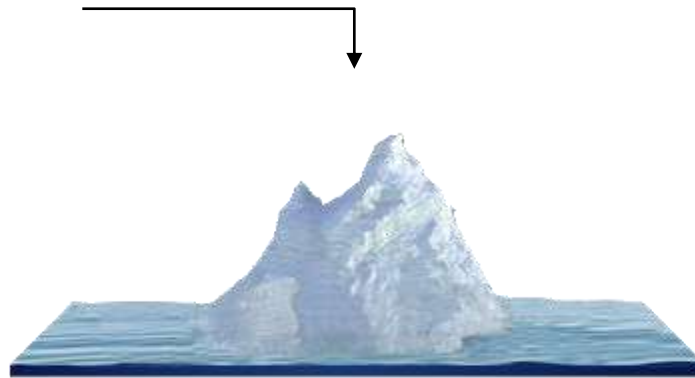


# What are our goals?

## The Santa Clause list

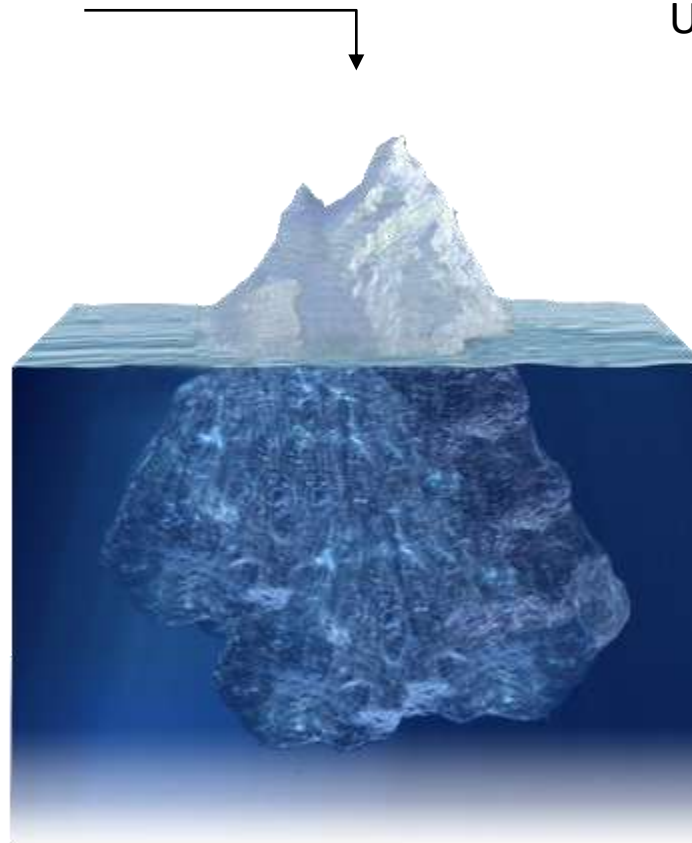
- . Where will diseases emerge or re-emerge – why, when, what can we do about it and how do we know it's working?
- . We want to predict, for instance
  - . Disease reservoirs and vectors, their interactions and their relative importance
  - . Spatio-temporal behaviour of disease and associated risk factors
  - . Dispersal characteristics
  - . Socio-demographic/economic risk factors
  - . Genetic susceptibility (at all levels)
- . We want an integrated systems analysis that takes into account the complex nature of disease and we want to understand

Known reservoirs  
Known vectors  
Known cases  
Known risk factors





Known reservoirs  
Known vectors  
Known cases  
Known risk factors



Unknown reservoirs  
Unknown vectors  
Unknown cases  
Unknown risk factors

***How do we model what's "under the water"?***

# Really, what is it?

Just good old fashioned modeling, statistical inference, but with a few twists...

Many variables/dimensions and multi-scale

Electronic format, "Unintentional" data

All necessary for modeling complex phenomena

**The Data Mining Approach**

|         |    |   |     |        |        |        |        |        |
|---------|----|---|-----|--------|--------|--------|--------|--------|
| 01      | d  | 1 | 1   | 4116   | 16.55  |        |        |        |
| 1836180 | 1  | d | 1   | 9936   | 4.02   |        |        |        |
| 2049031 | 02 | d | 5   | 422085 | 4.23   |        |        |        |
| 2174200 | 1  | d | 1   | 92145  | 0.13   |        |        |        |
| 1694    | 1  | d | 5   | 268682 | 2.30   |        |        |        |
| 3101582 | 02 | d | 6   | 643740 | 11.81  |        |        |        |
| 1386320 | 02 | d | 2   | 9      | 293129 | 3.71   |        |        |
| 3100652 | 01 | d | 2   | 1      | 296036 | 2.88   |        |        |
| 1404820 | 1  | d | 2   | 1      | 11.45  |        |        |        |
| 2160030 | 02 | d | 0.0 | 0.0    | 11506  | 166510 | 43091  |        |
| 2142337 | 01 | d | 1   | 0.0    | 0      | 68401  | 331964 | 139740 |

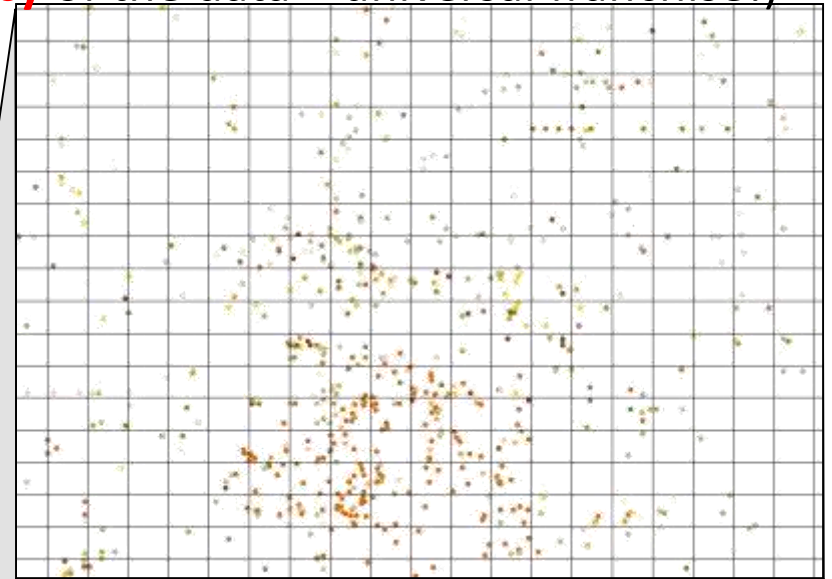
|       |        |        |        |        |        |       |
|-------|--------|--------|--------|--------|--------|-------|
| 1     | 166476 | 75192  | 550464 |        |        |       |
| 21651 | 5      | 12738  | 57600  | 25575  |        |       |
| 20531 | 6      | 11115  | 10338  | 11731  | 0      | 90198 |
| 2842  | 3      | 92166  | 245845 | 98756  | 255378 |       |
| 17707 | 9      | 0593   | 32394  | 125695 |        |       |
| 18733 | 2      | 21335  | 035    | 22990  | 31376  |       |
| 15218 | 1      | 46455  | 27     | 43754  | 205793 |       |
| 17435 | 6      | 134912 | 24709  | 77960  |        |       |
| 15781 | 5      | 116346 | 96207  | 181007 |        |       |
| 15621 | 6      | 4456   | 87958  | 117479 |        |       |
| 1823  | 3      | 59726  | 62718  | 352328 |        |       |

**But what are we  
going to mine...!**

# Anything and everything!

- ⤴ Collection data
- ⤴ Ecological niche data
- ⤴ Ecological niche model data
- ⤴ Socio-economic data
- ⤴ Socio-demographic data
- ⤴ Phenotypic data
- ⤴ Vegetable and crop cover
- ⤴ Geographical data
- ⤴ Medical and public health data...

(A **democracy** of the data – universal franchise!)



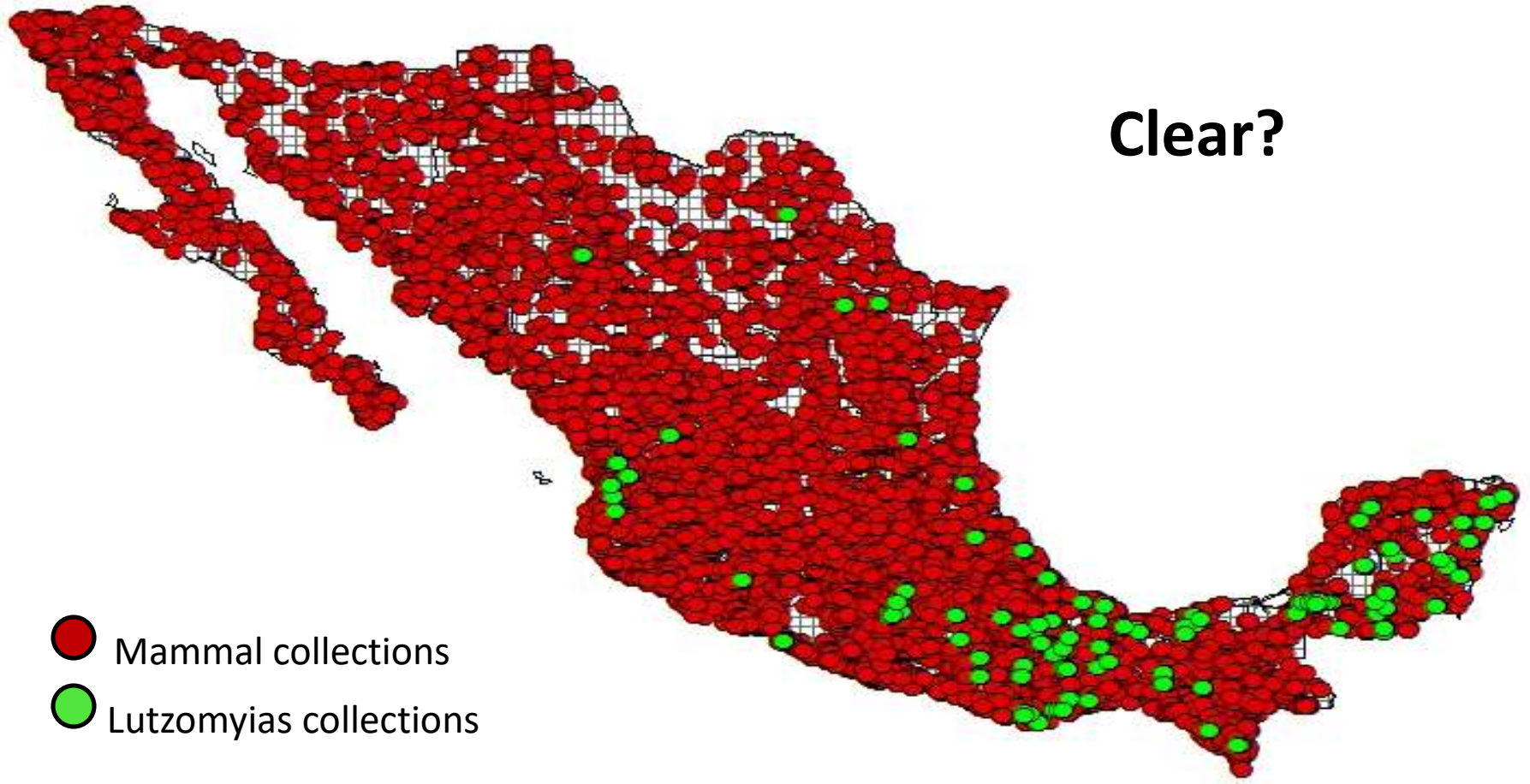
The data are represented in space and time – spatial data mining

# But all data are not created equal...

- Different sources
  - Different location, data base, access,...
- Different data type – categorical, metric
- Different spatial resolution
  - Explicit – e.g., pixel by pixel in environmental layers
  - Implicit – 30,000,000 data points versus 30
    - Quality versus quantity
    - Abiotic versus biotic

Need to avoid the tyranny of the majority and protect minority rights!  
Also, we need to be able to compare apples with apples!

- But the real Niche Space of a disease is VERY big!
- Where do we start?
- With the biotic...
- With the “ecological” part, reservoirs and vectors and all that...

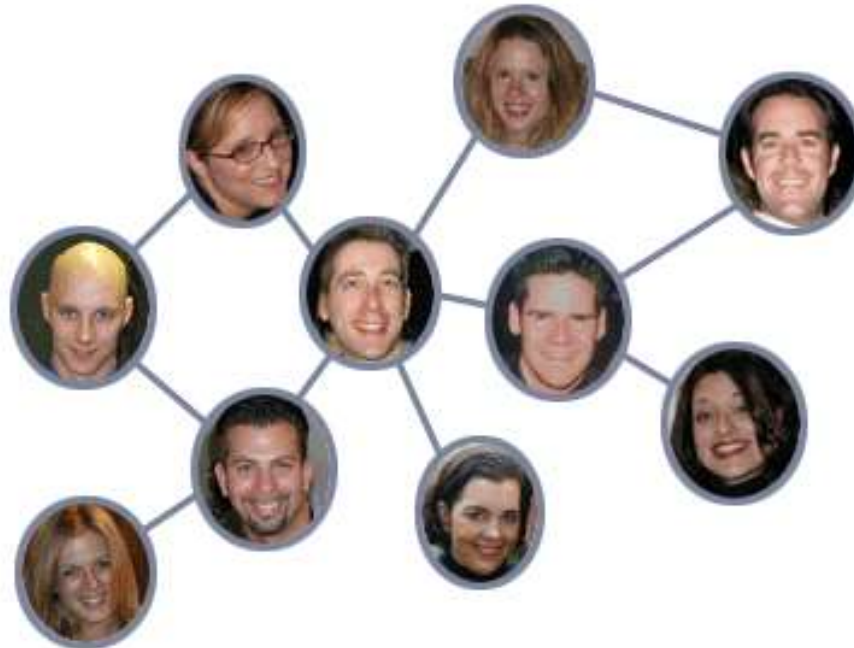


Clear?

- Mammal collections
- Lutzomyias collections

# You can judge a man by his “friends”

or his “enemies”, or “parasites”,  
or “prey” or “predators” or...





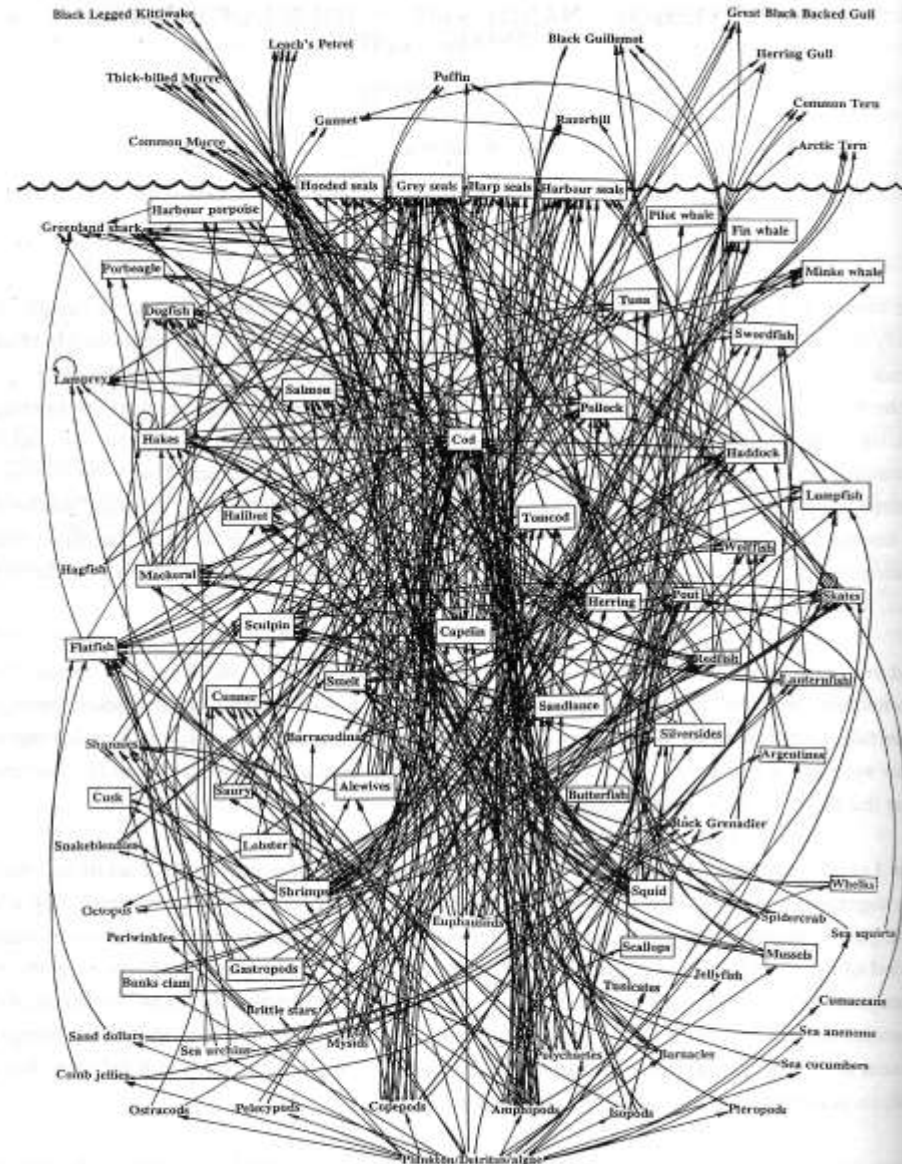
## Food web associated with Cod for northwest Atlantic

Author(s):  
Prof. David Lavigne

Institution:  
Natural Sciences and Engineering Research  
Council

Visualization of **known** interactions  
at the species level

No spatio-temporal input



# Using Networks to Infer Reservoir-Vector Interactions

- Take nodes to be...
  - Species, other taxonomic or phylogenetic groupings, groupings by phenotypic characteristics,
- Take links to be a statistical measure of spatial (temporal) co-occurrence
  - $P(Y|X)$ ,  $\epsilon(Y|X)$ ,  $P(A,B|C,D)$ ,  $\epsilon(Z|X,Y)$
  - What is a high/low degree of co-occurrence?
  - What spatial (temporal) resolution? (When do things co-occur?)

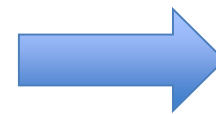
No co-occurrences

|   |   |   |   |   |   |
|---|---|---|---|---|---|
|   |   | a |   |   |   |
|   |   |   | b |   | a |
|   |   |   |   |   |   |
| a |   |   |   |   |   |
|   | b |   |   | a |   |



Two co-occurrences

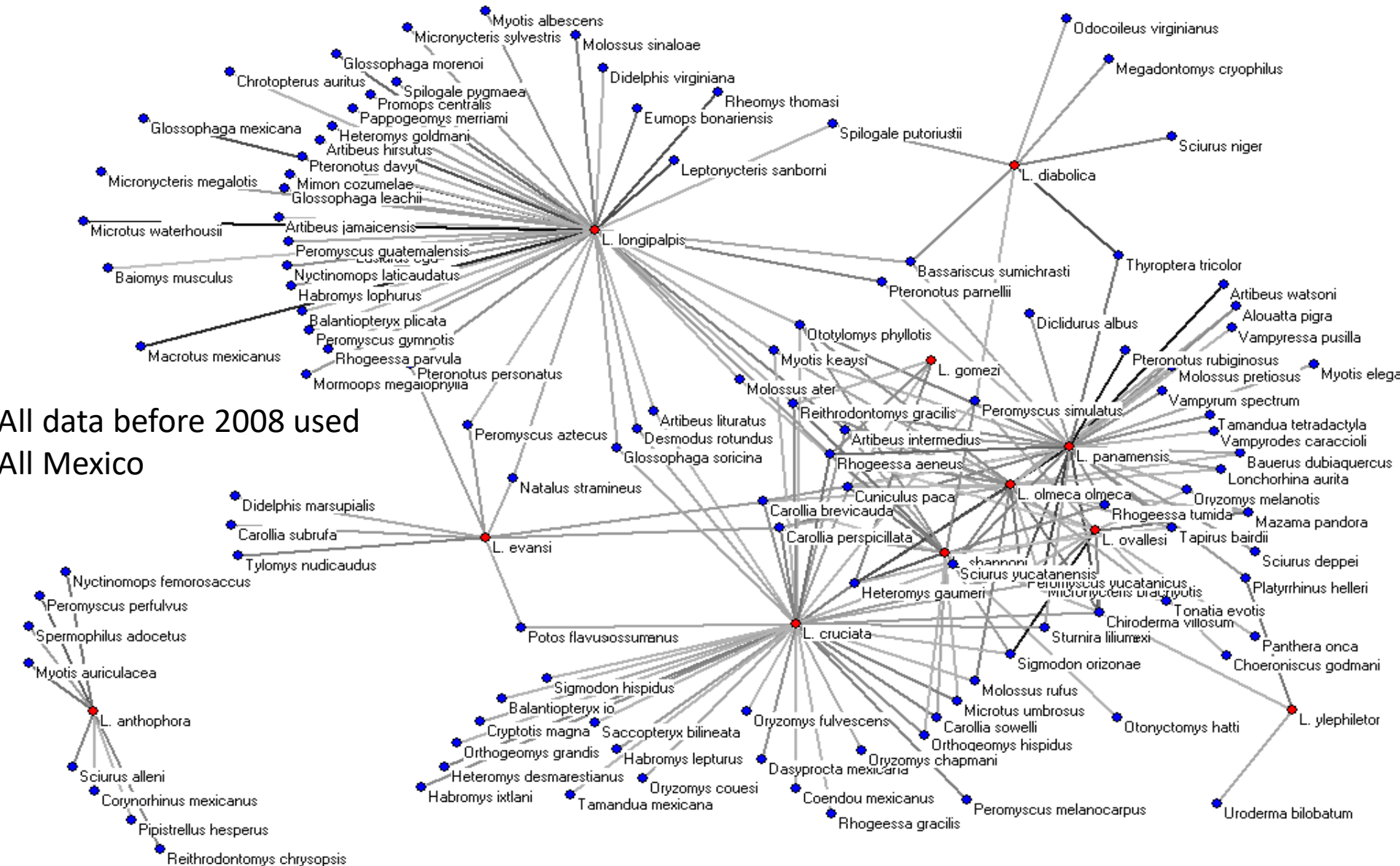
|     |     |   |
|-----|-----|---|
|     | a b | a |
| a   |     |   |
| a b |     | a |



One co-occurrence

|        |
|--------|
| 5 a 2b |
|--------|

# Who's friends with Lutzomyias?



# Predicting Reservoirs

The 150 (out of 427) “best friends” of *Lutzomyia* as a genera.  
The model works on known results.

|    | Mammals                           | Epsilon | Conf. |
|----|-----------------------------------|---------|-------|
| 1  | <i>Eira barbara</i>               | 10.1683 |       |
| 2  | <i>Rhogeessa aeneus</i>           | 9.3649  |       |
| 3  | <i>Artibeus intermedius</i>       | 9.1628  |       |
| 4  | <i>Reithrodontomys gracilis</i>   | 8.8921  | Yes   |
| 5  | <i>Carollia sowelli</i>           | 8.8303  |       |
| 6  | <i>Heteromys gaumeri</i>          | 8.8000  | Yes   |
| 7  | <i>Peromyscus mexicanus</i>       | 8.7859  |       |
| 8  | <i>Heteromys desmarestianus</i>   | 8.7164  | Yes   |
| 9  | <i>Molossus rufus</i>             | 8.6277  |       |
| 10 | <i>Glossophaga soricina</i>       | 8.5713  |       |
| 11 | <i>Carollia perspicillata</i>     | 8.5030  |       |
| 12 | <i>Orthogeomys hispidus</i>       | 8.3468  |       |
| 13 | <i>Pteronotus parnellii</i>       | 8.1632  |       |
| 14 | <i>Desmodus rotundus</i>          | 8.1519  |       |
| 15 | <i>Dasyprocta mexicana</i>        | 8.1128  |       |
| 16 | <i>Sturnira lilium</i>            | 8.0290  |       |
| 17 | <i>Dermanura phaeotis</i>         | 8.0055  |       |
| 18 | <i>Dasyprocta punctata</i>        | 7.9678  |       |
| 19 | <i>Oryzomys couesi</i>            | 7.7253  |       |
| 20 | <i>Potos flavus</i>               | 7.7246  |       |
| 21 | <i>Conepatus semistriatus</i>     | 7.6879  |       |
| 22 | <i>Ototylomys phyllotis</i>       | 7.5587  | Yes   |
| 23 | <i>Ateles geoffroyi</i>           | 7.4787  |       |
| 24 | <i>Cryptotis magna</i>            | 7.4207  |       |
| 25 | <i>Cuniculus paca</i>             | 7.3220  |       |
| 26 | <i>Lamproncycteris brachyotis</i> | 7.2852  |       |
| 27 | <i>Sigmodon hispidus</i>          | 7.2805  | Yes   |
| 28 | <i>Peromyscus yucatanicus</i>     | 7.2486  | Yes   |
| 29 | <i>Oryzomys chapmani</i>          | 7.1242  |       |
| 30 | <i>Didelphis virginiana</i>       | 7.1150  |       |
| 31 | <i>Peromyscus melanocarpus</i>    | 7.0260  |       |
| 32 | <i>Microtus umbrosus</i>          | 6.9630  |       |
| 33 | <i>Thyroptera tricolor</i>        | 6.9630  |       |
| 34 | <i>Nasua narica</i>               | 6.8953  |       |
| 35 | <i>Megadontomys cryophilus</i>    | 6.8830  |       |
| 36 | <i>Oryzomys alfaroi</i>           | 6.6816  |       |
| 37 | <i>Sorex veraepacis</i>           | 6.6797  |       |
| 38 | <i>Carollia subrufa</i>           | 6.6316  |       |
| 39 | <i>Peromyscus aztecus</i>         | 6.6173  |       |
| 40 | <i>Didelphis marsupialis</i>      | 6.4390  | Yes   |
| 41 | <i>Sciurus yucatanensis</i>       | 6.3865  |       |
| 42 | <i>Philander opossum</i>          | 6.2546  |       |
| 43 | <i>Habromys ixtlani</i>           | 6.1120  |       |
| 44 | <i>Microtus waterhousii</i>       | 6.1120  |       |
| 45 | <i>Pteronotus rubiginosus</i>     | 6.1120  |       |
| 46 | <i>Reithrodontomys microdor</i>   | 6.0967  |       |
| 47 | <i>Coendou mexicanus</i>          | 6.0268  |       |
| 48 | <i>Centurio senex</i>             | 6.0076  |       |
| 49 | <i>Artibeus jamaicensis</i>       | 5.9786  |       |
| 50 | <i>Glossophaga morenoi</i>        | 5.8847  |       |

|     | Mammals                          | Epsilon | Conf. |
|-----|----------------------------------|---------|-------|
| 51  | <i>Molossus sinaloae</i>         | 5.8518  |       |
| 52  | <i>Artibeus lituratus</i>        | 5.8422  |       |
| 53  | <i>Mormoops megalophylla</i>     | 5.8374  |       |
| 54  | <i>Habromys lepturus</i>         | 5.7848  |       |
| 55  | <i>Myotis keaysi</i>             | 5.6148  |       |
| 56  | <i>Chiroderma villosum</i>       | 5.5562  |       |
| 57  | <i>Tamandua mexicana</i>         | 5.4845  |       |
| 58  | <i>Tylomys nudicaudus</i>        | 5.4510  |       |
| 59  | <i>Saccolaryx bilineata</i>      | 5.2984  |       |
| 60  | <i>Macrotus mexicanus</i>        | 5.2472  |       |
| 61  | <i>Sciurus aureogaster</i>       | 5.2267  |       |
| 62  | <i>Baiomys musculus</i>          | 5.2092  |       |
| 63  | <i>Rhogeessa tumida</i>          | 5.1950  |       |
| 64  | <i>Sciurus deppii</i>            | 5.1414  |       |
| 65  | <i>Dermanura watsoni</i>         | 5.1338  |       |
| 66  | <i>Otonyctomys hatti</i>         | 5.1338  |       |
| 67  | <i>Orthogeomys grandis</i>       | 5.0556  |       |
| 68  | <i>Alouatta palliata</i>         | 5.0457  |       |
| 69  | <i>Choeroniscus godmani</i>      | 5.0457  |       |
| 70  | <i>Peropteryx macrotis</i>       | 5.0457  |       |
| 71  | <i>Pteronotus personatus</i>     | 5.0266  |       |
| 72  | <i>Lontra longicaudis</i>        | 4.9330  |       |
| 73  | <i>Reithrodontomys mexicanus</i> | 4.9120  |       |
| 74  | <i>Oryzomys rostratus</i>        | 4.8681  |       |
| 75  | <i>Mimon cozumelae</i>           | 4.8327  |       |
| 76  | <i>Pteronotus davyi</i>          | 4.7943  |       |
| 77  | <i>Herpailurus yagouaroundi</i>  | 4.7100  |       |
| 78  | <i>Glossophaga leachii</i>       | 4.6849  |       |
| 79  | <i>Rhogeessa gracilis</i>        | 4.6317  |       |
| 80  | <i>Sylvilagus brasiliensis</i>   | 4.6317  |       |
| 81  | <i>Hodomys alleni</i>            | 4.5155  |       |
| 82  | <i>Leopardus wiedii</i>          | 4.4420  |       |
| 83  | <i>Peromyscus simulatus</i>      | 4.4195  |       |
| 84  | <i>Sigmodon alleni</i>           | 4.3707  |       |
| 85  | <i>Bassariscus sumichrasti</i>   | 4.3110  |       |
| 86  | <i>Oryzomys fulvescens</i>       | 4.3110  |       |
| 87  | <i>Diphylia ecaudata</i>         | 4.3013  |       |
| 88  | <i>Oryzomys melanotis</i>        | 4.2907  | Yes   |
| 89  | <i>Micronycteris microtis</i>    | 4.2338  |       |
| 90  | <i>Mazama americana</i>          | 4.2274  |       |
| 91  | <i>Microtus oaxacensis</i>       | 4.2061  |       |
| 92  | <i>Rheomys thomasi</i>           | 4.2061  |       |
| 93  | <i>Oryzomys saturator</i>        | 4.2061  |       |
| 94  | <i>Myotis elegans</i>            | 4.2024  |       |
| 95  | <i>Oligoryzomys fulvescens</i>   | 4.1984  |       |
| 96  | <i>Natalus stramineus</i>        | 4.0626  |       |
| 97  | <i>Balantiopteryx io</i>         | 4.0522  |       |
| 98  | <i>Nyctinomops laticaudatus</i>  | 4.0522  |       |
| 99  | <i>Tlacuatzin canescens</i>      | 4.0119  |       |
| 100 | <i>Odocoileus virginianus</i>    | 3.9265  |       |

|     | Mammals                         | Epsilon | Conf. |
|-----|---------------------------------|---------|-------|
| 101 | <i>Balantiopteryx plicata</i>   | 3.8590  |       |
| 102 | <i>Peromyscus leucopus</i>      | 3.7994  |       |
| 103 | <i>Sturnina ludovici</i>        | 3.7888  |       |
| 104 | <i>Enchisthenes hartii</i>      | 3.6929  |       |
| 105 | <i>Vampyroides caraccioli</i>   | 3.6929  |       |
| 106 | <i>Eptesicus furinalis</i>      | 3.6453  |       |
| 107 | <i>Liomys pictus</i>            | 3.6107  |       |
| 108 | <i>Glossophaga commissarisi</i> | 3.4861  |       |
| 109 | <i>Lonchorhina aurita</i>       | 3.4781  |       |
| 110 | <i>Phyllostomus discolor</i>    | 3.4781  |       |
| 111 | <i>Peromyscus gymnotis</i>      | 3.4516  |       |
| 112 | <i>Anoura geoffroyi</i>         | 3.4201  |       |
| 113 | <i>Platyrrhinus helleri</i>     | 3.3586  |       |
| 114 | <i>Eumops bonariensis</i>       | 3.3398  |       |
| 115 | <i>Sciurus variegatoides</i>    | 3.3398  |       |
| 116 | <i>Uroderma bilobatum</i>       | 3.3373  |       |
| 117 | <i>Lasiurus intermedius</i>     | 3.2197  |       |
| 118 | <i>Lasiurus ega</i>             | 3.1739  |       |
| 119 | <i>Peromyscus megalops</i>      | 3.1410  |       |
| 120 | <i>Eumops glaucinus</i>         | 3.0564  |       |
| 121 | <i>Urocyon cinereoargenteus</i> | 2.9697  |       |
| 122 | <i>Procyon lotor</i>            | 2.9502  |       |
| 123 | <i>Hylonycteris underwoodi</i>  | 2.9343  |       |
| 124 | <i>Rhynchonycteris naso</i>     | 2.8580  |       |
| 125 | <i>Eptesicus brasiliensis</i>   | 2.8106  |       |
| 126 | <i>Myotis albescens</i>         | 2.8106  |       |
| 127 | <i>Lophostoma evotis</i>        | 2.8106  |       |
| 128 | <i>Tapirus bairdii</i>          | 2.8106  |       |
| 129 | <i>Vampyrum spectrum</i>        | 2.8106  |       |
| 130 | <i>Marmosa mexicana</i>         | 2.7731  | Yes   |
| 131 | <i>Peromyscus furvus</i>        | 2.7731  |       |
| 132 | <i>Myotis velifera</i>          | 2.5757  |       |
| 133 | <i>Spilogale putorius</i>       | 2.5411  |       |
| 134 | <i>Microtus mexicanus</i>       | 2.5268  |       |
| 135 | <i>Dasybus novemcinctus</i>     | 2.4725  |       |
| 136 | <i>Myotis nigricans</i>         | 2.4704  |       |
| 137 | <i>Lophostoma brasiliense</i>   | 2.4407  |       |
| 138 | <i>Didelurus albus</i>          | 2.4407  |       |
| 139 | <i>Sciurus niger</i>            | 2.4407  |       |
| 140 | <i>Leptonycteris curasoae</i>   | 2.4268  |       |
| 141 | <i>Nyctomys sumichrasti</i>     | 2.4026  |       |
| 142 | <i>Sigmodon mascotensis</i>     | 2.3815  |       |
| 143 | <i>Alouatta pigra</i>           | 2.3374  |       |
| 144 | <i>Peromyscus melanophrys</i>   | 2.2204  |       |
| 145 | <i>Dermanura tolteca</i>        | 2.1920  |       |
| 146 | <i>Trachops cirrhosus</i>       | 2.1663  |       |
| 147 | <i>Bauerus dubiaquercus</i>     | 2.1612  |       |
| 148 | <i>Spilogale pygmaea</i>        | 2.1612  |       |
| 149 | <i>Leptonycteris nivalis</i>    | 2.1402  |       |
| 150 | <i>Sylvilagus floridanus</i>    | 2.1002  |       |

# But how to test it...?

## The Emerging Disease production line

Requires large, well-organized interdisciplinary team

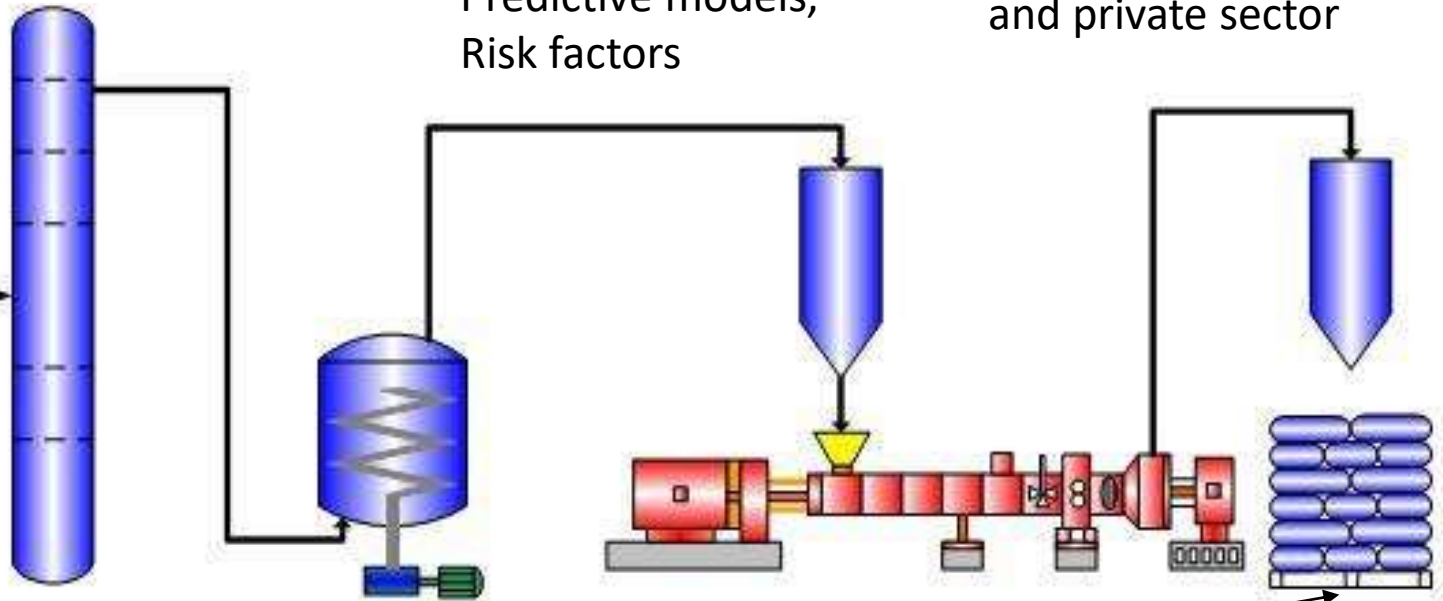
Links to IMSS and INSP

Close relationship with public health authorities and private sector

Data Mining:  
Predictive models,  
Risk factors

Field work :  
samples

Five groups distributed throughout Mexico  
DF, Chiap., NL, Jal., Tab.



Laboratory analysis

Solutions:

- ^ Decision support systems
- ^ Treatments
- ^ Intelligent software

Over 1200 mammals collected from over 70 species

Two laboratories

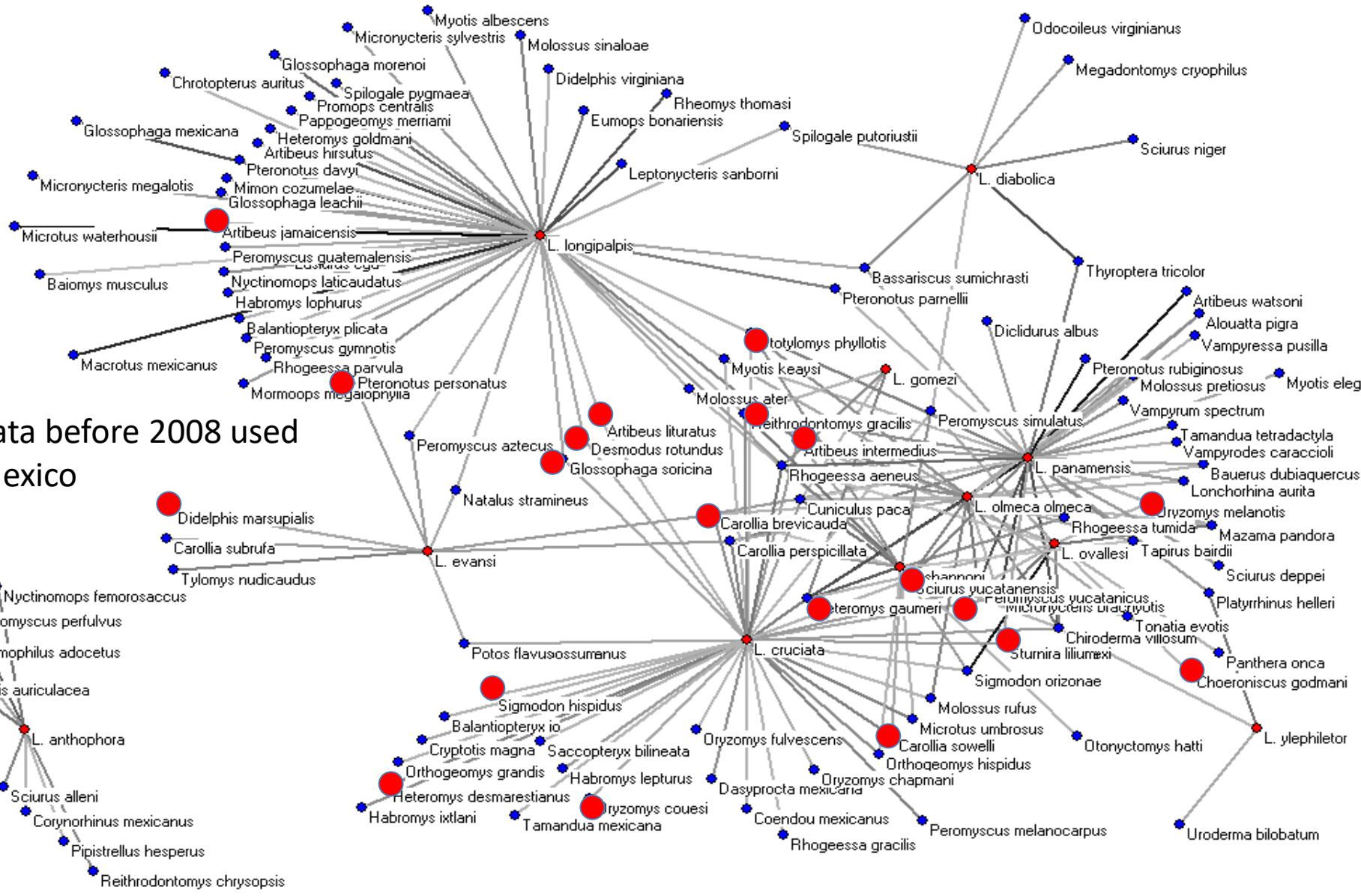
PCR tests on samples for different diseases

# Predicting Reservoirs

|    | Mammals                   | Epsilon | Conf. |
|----|---------------------------|---------|-------|
| 1  | Eira barbara              | 10.1683 |       |
| 2  | Rhogeessa aeneus          | 9.3649  |       |
| 3  | Artibeus intermedius      | 9.1628  |       |
| 4  | Reithrodontomys gracilis  | 8.8921  | Yes   |
| 5  | Carollia sowelli          | 8.8303  |       |
| 6  | Heteromys gaumeri         | 8.8000  | Yes   |
| 7  | Peromyscus mexicanus      | 8.7859  |       |
| 8  | Heteromys desmarestianus  | 8.7164  | Yes   |
| 9  | Molossus rufus            | 8.6277  |       |
| 10 | Glossophaga soricina      | 8.5713  |       |
| 11 | Carollia perspicillata    | 8.5030  |       |
| 12 | Orthogeomys hispidus      | 8.3468  |       |
| 13 | Pteronotus parnellii      | 8.1632  |       |
| 14 | Desmodus rotundus         | 8.1519  |       |
| 15 | Dasyprocta mexicana       | 8.1128  |       |
| 16 | Sturnira lilium           | 8.0290  |       |
| 17 | Dermanura phaeotis        | 8.0055  |       |
| 18 | Dasyprocta punctata       | 7.9678  |       |
| 19 | Oryzomys couesi           | 7.7253  |       |
| 20 | Potos flavus              | 7.7246  |       |
| 21 | Conopatus semistriatus    | 7.6879  |       |
| 22 | Ototylomys phyllotis      | 7.5587  | Yes   |
| 23 | Ateles geoffroyi          | 7.4787  |       |
| 24 | Cryptotis magna           | 7.4207  |       |
| 25 | Cuniculus paca            | 7.3220  |       |
| 26 | Lampronycteris brachyotis | 7.2852  |       |
| 27 | Sigmodon hispidus         | 7.2805  | Yes   |
| 28 | Peromyscus yucatanicus    | 7.2486  | Yes   |
| 29 | Oryzomys chapmani         | 7.1242  |       |
| 30 | Didelphis virginiana      | 7.1150  |       |
| 31 | Peromyscus melanocarpus   | 7.0260  |       |
| 32 | Microtus umbrinus         | 6.9630  |       |
| 33 | Thyroptera tricolor       | 6.9630  |       |
| 34 | Nasua narica              | 6.8953  |       |
| 35 | Megadontomys cryophilus   | 6.6830  |       |
| 36 | Oryzomys alfaroi          | 6.6816  |       |
| 37 | Sorex veraepacis          | 6.6797  |       |
| 38 | Carollia subrufa          | 6.6316  |       |
| 39 | Peromyscus aztecus        | 6.6173  |       |
| 40 | Didelphis marsupialis     | 6.4390  | Yes   |
| 41 | Sciurus yucatanensis      | 6.3865  |       |
| 42 | Philander opossum         | 6.2546  |       |
| 43 | Habromys ixtlani          | 6.1120  |       |
| 44 | Microtus waterhousii      | 6.1120  |       |
| 45 | Pteronotus rubiginosus    | 6.1120  |       |
| 46 | Reithrodontomys microrod  | 6.0967  |       |
| 47 | Coendou mexicanus         | 6.0268  |       |
| 48 | Centurio senex            | 6.0076  |       |
| 49 | Artibeus jamaicensis      | 5.9786  |       |
| 50 | Glossophaga morenoi       | 5.8847  |       |

|     | Mammals                   | Epsilon | Conf. |
|-----|---------------------------|---------|-------|
| 51  | Molossus sinaloae         | 5.8518  |       |
| 52  | Artibeus lituratus        | 5.8422  |       |
| 53  | Mormoops megalophylla     | 5.8374  |       |
| 54  | Habromys lepturus         | 5.7848  |       |
| 55  | Myotis keaysi             | 5.6148  |       |
| 56  | Chiroderma villosum       | 5.5562  |       |
| 57  | Tamandua mexicana         | 5.4845  |       |
| 58  | Tylomys nudicaudus        | 5.4510  |       |
| 59  | Sacropteryx bilineata     | 5.2984  |       |
| 60  | Macrotus mexicanus        | 5.2472  |       |
| 61  | Sciurus aureogaster       | 5.2267  |       |
| 62  | Baiomys musculus          | 5.2092  |       |
| 63  | Rhogeessa tumida          | 5.1950  |       |
| 64  | Sciurus deppii            | 5.1414  |       |
| 65  | Dermanura watsoni         | 5.1338  |       |
| 66  | Otonyctomys hatti         | 5.1338  |       |
| 67  | Orthogeomys grandis       | 5.0556  |       |
| 68  | Alouatta palliata         | 5.0457  |       |
| 69  | Choerioniscus godmani     | 5.0457  |       |
| 70  | Peropteryx macrotis       | 5.0457  |       |
| 71  | Pteronotus personatus     | 5.0267  |       |
| 72  | Lontra longicaudis        | 4.9330  |       |
| 73  | Reithrodontomys mexicanus | 4.9120  |       |
| 74  | Oryzomys rostratus        | 4.8681  |       |
| 75  | Mimon cozumelae           | 4.8327  |       |
| 76  | Pteronotus davyi          | 4.7943  |       |
| 77  | Herpailurus yagouaroundi  | 4.7100  | Yes   |
| 78  | Glossophaga leachii       | 4.6849  |       |
| 79  | Rhogeessa gracilis        | 4.6317  |       |
| 80  | Sylvilagus brasiliensis   | 4.6317  |       |
| 81  | Hodomys alleni            | 4.5155  |       |
| 82  | Leopardus wiedii          | 4.4420  |       |
| 83  | Peromyscus simulatus      | 4.4195  |       |
| 84  | Sigmodon alleni           | 4.3707  |       |
| 85  | Bassariscus sumichrasti   | 4.3110  |       |
| 86  | Oryzomys fulvescens       | 4.3110  |       |
| 87  | Diphylla ecaudata         | 4.3013  |       |
| 88  | Oryzomys melanotis        | 4.2907  | Yes   |
| 89  | Micronycteris microtis    | 4.2338  |       |
| 90  | Mazama americana          | 4.2274  |       |
| 91  | Microtus oaxacensis       | 4.2061  |       |
| 92  | Rheomys thomasi           | 4.2061  |       |
| 93  | Oryzomys saturator        | 4.2061  |       |
| 94  | Myotis elegans            | 4.2024  |       |
| 95  | Oligoryzomys fulvescens   | 4.1984  |       |
| 96  | Natalus stramineus        | 4.0626  |       |
| 97  | Balantiopteryx io         | 4.0522  |       |
| 98  | Nyctinomops laticaudatus  | 4.0522  |       |
| 99  | Tlacuatzin canescens      | 4.0119  |       |
| 100 | Odocoileus virginianus    | 3.9265  |       |

|     | Mammals                  | Epsilon | Conf. |
|-----|--------------------------|---------|-------|
| 101 | Balantiopteryx plicata   | 3.8590  |       |
| 102 | Peromyscus leucopus      | 3.7994  |       |
| 103 | Sturnira ludovici        | 3.7888  |       |
| 104 | Enchisthenes hartii      | 3.6929  |       |
| 105 | Vampyroides caraccioli   | 3.6929  |       |
| 106 | Eptesicus furinallis     | 3.6453  |       |
| 107 | Liomys pictus            | 3.6107  |       |
| 108 | Glossophaga commissaris  | 3.4861  |       |
| 109 | Lonchorhina aurita       | 3.4781  |       |
| 110 | Phyllostomus discolor    | 3.4781  |       |
| 111 | Peromyscus gymnotis      | 3.4516  |       |
| 112 | Anoura geoffroyi         | 3.4201  |       |
| 113 | Platyrrhinus helleri     | 3.3586  |       |
| 114 | Eumops bonariensis       | 3.3398  |       |
| 115 | Sciurus variegatoides    | 3.3398  |       |
| 116 | Uroderma bilobatum       | 3.3373  |       |
| 117 | Lasiurus intermedius     | 3.2197  |       |
| 118 | Lasiurus ega             | 3.1739  |       |
| 119 | Peromyscus megalops      | 3.1410  |       |
| 120 | Eumops glaucinus         | 3.0564  |       |
| 121 | Urocyon cinereoargenteus | 2.9697  |       |
| 122 | Procyon lotor            | 2.9502  |       |
| 123 | Hylonycteris underwoodi  | 2.9343  |       |
| 124 | Rhynchonycteris naso     | 2.8580  |       |
| 125 | Eptesicus brasiliensis   | 2.8106  |       |
| 126 | Myotis albescens         | 2.8106  |       |
| 127 | Lophostoma evotis        | 2.8106  |       |
| 128 | Tapirus bairdii          | 2.8106  |       |
| 129 | Vampyrus spectrum        | 2.8106  |       |
| 130 | Marmosa mexicana         | 2.7731  | Yes   |
| 131 | Peromyscus furvus        | 2.7731  |       |
| 132 | Myotis velifera          | 2.5757  |       |
| 133 | Spilogale putorius       | 2.5411  |       |
| 134 | Microtus mexicanus       | 2.5268  |       |
| 135 | Dasyypus novemcinctus    | 2.4725  |       |
| 136 | Myotis nigricans         | 2.4704  |       |
| 137 | Lophostoma brasiliense   | 2.4407  |       |
| 138 | Diclidurus albus         | 2.4407  |       |
| 139 | Sciurus niger            | 2.4407  |       |
| 140 | Leptonycteris curasoae   | 2.4268  |       |
| 141 | Nyctomys sumichrasti     | 2.4026  |       |
| 142 | Sigmodon mascotensis     | 2.3815  |       |
| 143 | Alouatta pigra           | 2.3374  |       |
| 144 | Peromyscus melanophrys   | 2.2204  |       |
| 145 | Dermanura tolteca        | 2.1920  |       |
| 146 | Trachops cirrhosus       | 2.1663  |       |
| 147 | Bauerus dubiaquercus     | 2.1612  |       |
| 148 | Spilogale pygmaea        | 2.1612  |       |
| 149 | Leptonycteris nivalis    | 2.1402  |       |
| 150 | Sylvilagus floridanus    | 2.1002  |       |



All data before 2008 used  
 All Mexico



- Predicted and confirmed 20 new species of mammal as carriers of Leishmania in Mexico
- 12 of them are bats, identified for the first time in Mexico
- Squirrels identified as carriers
- Changes the picture for control of Leishmania totally; Leishmania and Lutzomyias are eclectic in their host source. Linnean classification is NOT ecologically relevant
- So we can see that the biotic (mammals/food) part of the Niche Space for Leishmaniasis is important. What about other factors?
  - Abiotic – Worldclim
  - Vegetation/landcover

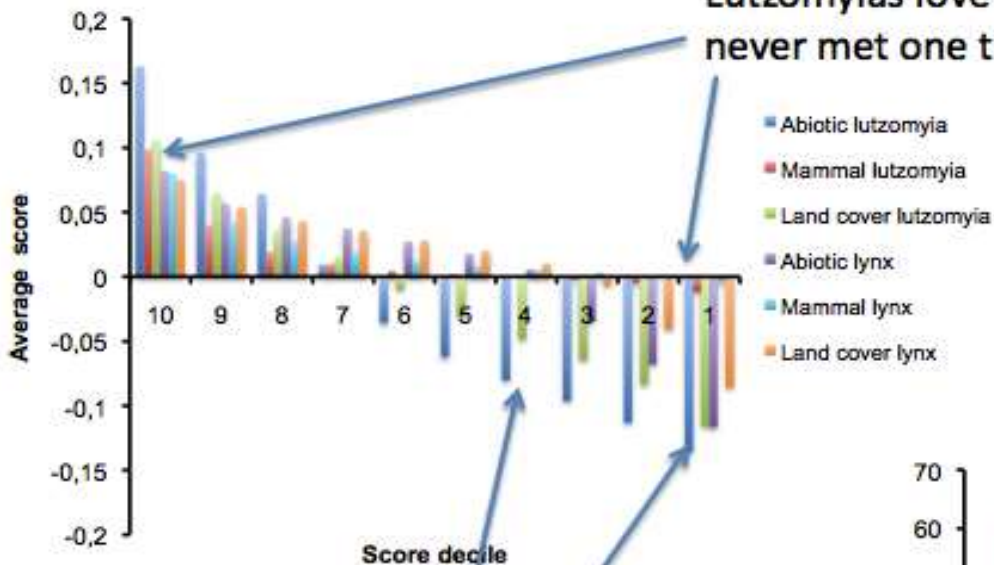


# Modelling the Niche Space of Leishmaniasis (well, Lutzomyias really)

| TOP DECILE<br>Optimal niche conditions for <i>Lutzomyia</i> |             |         |                    | BOTTOM DECILE<br>Suboptimal niche conditions for <i>Lutzomyia</i> |           |         |                 |
|---|-------------|---------|--------------------|---|-----------|---------|-----------------|
| ABIOTIC VARIABLES   | RANGE       | Epsilon | Score contribution | ABIOTIC VARIABLES   | RANGE     | Epsilon | Score contribut |
| BIO17   | 88-219      | 8.960   | 5.013              | BIO12   | 42-507    | -5.604  | -2.279          |
| BIO1  | 23.3-26.4   | 8.938   | 1.006              | BIO16   | 18-218    | -5.001  | -2.328          |
| BIO11   | 22.2-25.3   | 8.873   | 2.322              | BIO18   | 1-249     | -3.839  | -3.799          |
| BIO14   | 26-63       | 8.782   | 4.916              | BIO6  | 3.1-3.4   | -3.761  | -2.931          |
| BIO4  | 25.35-33.09 | 7.543   | 2.152              | BIO7  | 26.3-28.4 | -3.544  | -8.853          |
| BIO6  | 13.4-16.6   | 7.524   | 3.293              | BIO2  | 16.5-18.4 | -3.535  | -2.997          |
| BIO13   | 392-774     | 7.107   | 12.913             | BIO11   | 2.9-12.5  | -3.271  | -4.482          |
| BIO7  | 28.5-30.6   | 7.012   | 3.803              | BIO4  | 3310-7184 | -2.971  | -9.551          |
| BIO16   | 1019-2019   | 6.925   | 12.175             | BIO19   | 192-383   | -2.940  | -0.448          |
| BIO19   | 192-383     | 6.618   | 4.157              | BIO10   | 28.9-32.3 | -2.669  | -0.916          |
| BIO12   | 1906-3302   | 6.314   | 8.701              | BIO1  | 10.3-19.9 | -2.189  | -1.033          |
| BIO2  | 9.8-10.8    | 6.130   | 4.458              | BIO3  | 3.7-5.5   | -2.130  | -3.576          |
| BIO18   | 623-746     | 5.748   | 1.260              | BIO8  | 28.4-31.7 | -1.964  | -0.731          |
| RESERVOIRS  |             |         |                    | RESERVOIRS  |           |         |                 |
| <i>Reithrodontomys gracilis</i>                             |             | 8.892   | 2.640              | <i>Sigmodon hispidus</i>  |           | 6.946   | 1.244           |
| <i>Heteromys gaueri</i>                                     |             | 8.800   | 2.234              |   |           |         |                 |
| <i>Heteromys desmarestianus</i>                             |             | 8.716   | 2.381              |   |           |         |                 |
| <i>Ototylomys phyllotis</i>                                 |             | 7.559   | 2.028              |   |           |         |                 |
| <i>Peromyscus yucatanicus</i>                               |             | 7.249   | 2.116              |   |           |         |                 |
| <i>Sigmodon hispidus</i>                                    |             | 6.946   | 1.244              |   |           |         |                 |
| <i>Didelphis marsupialis</i>                                |             | 5.774   | 1.662              |   |           |         |                 |
| <i>Oryzomys melanotis</i>                                   |             | 3.494   | 1.387              |   |           |         |                 |
| <i>Marmosa mexicana</i>                                     |             | 2.773   | 1.541              |   |           |         |                 |
| LAND COVER  |             |         |                    | LAND COVER  |           |         |                 |
| Cloud forest  |             | 6.642   | 1.408              | Subtropical scrub   |           | -1.675  | -1.527          |
| Tropical evergreen forest                                   |             | 6.603   | 4.476              | Subtropical scrub with secondary vegetation                       |           | -1.849  | -1.658          |
| Cloud forest with secondary vegetation                      |             | 6.028   | 1.459              | Xeric scrub with secondary vegetation                             |           | -2.092  | -3.640          |
| Tropical evergreen forest with secondary vegetation         |             | 6.007   | 4.344              | Xeric scrub   |           | -2.924  | -4.044          |
| Agriculture areas   |             | 5.966   | 1.736              | Mesquite  |           | -3.337  | -1.714          |
| Human settlement  |             | 4.947   | 0.577              | Grassland   |           | -3.734  | -1.874          |
| Deciduous tropical forest with secondary vegetation         |             | 4.081   | 1.013              | Mangroves   |           | -4.063  | -2.000          |

# Modelling the Niche Space of Leishmaniasis (well, Lutzomyias really)

Normalized niche scores

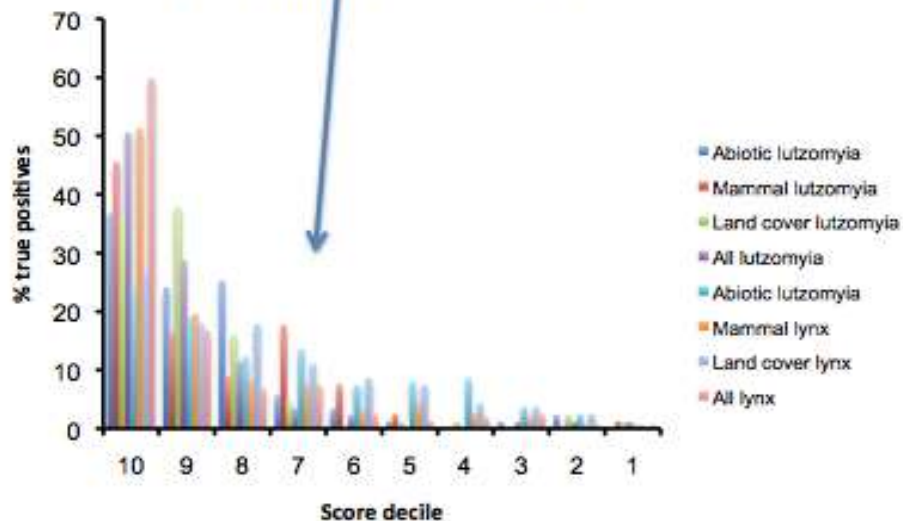


Climatic factors are more important for determining where Lutzomyias aren't rather than where they are

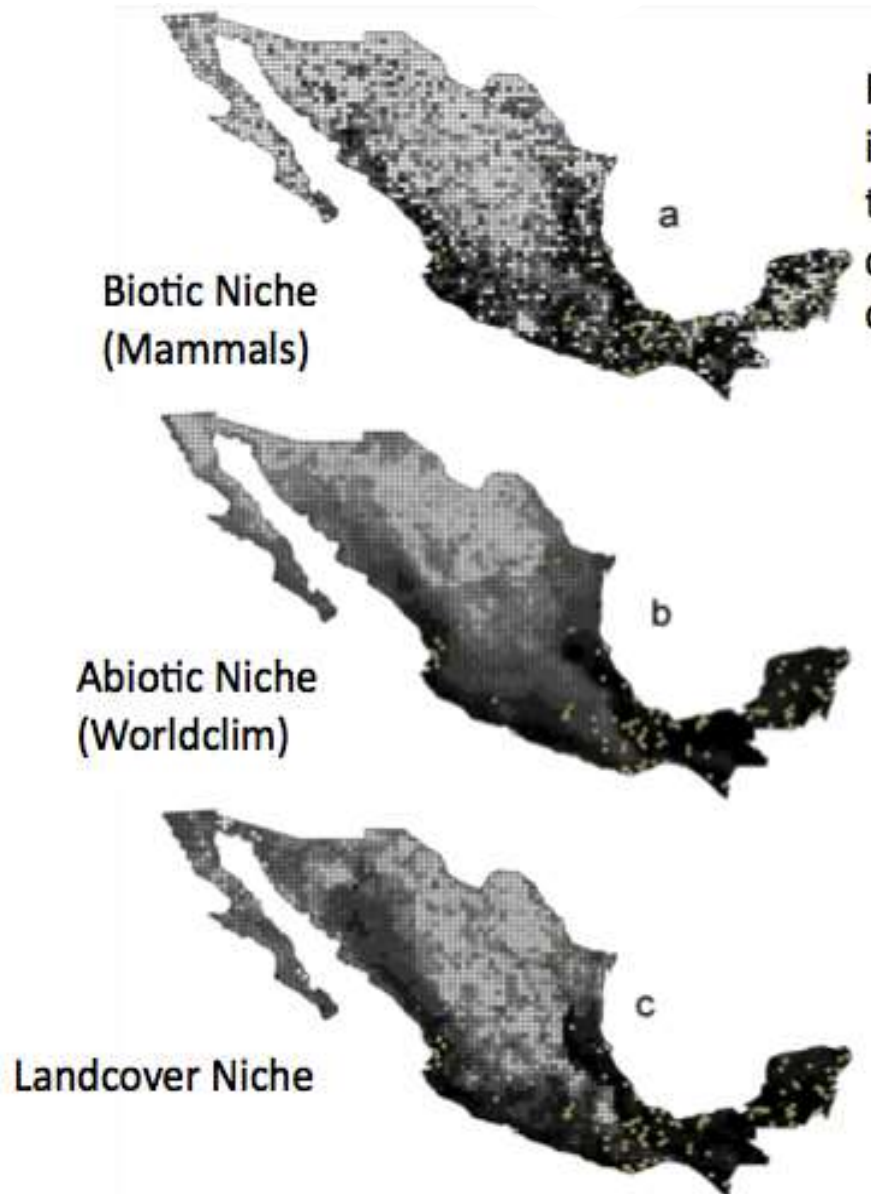
Lutzomyias love mammals, never met one they didn't like

Including in a fuller, richer Niche Space leads to more predictive models (less false positives/negatives)

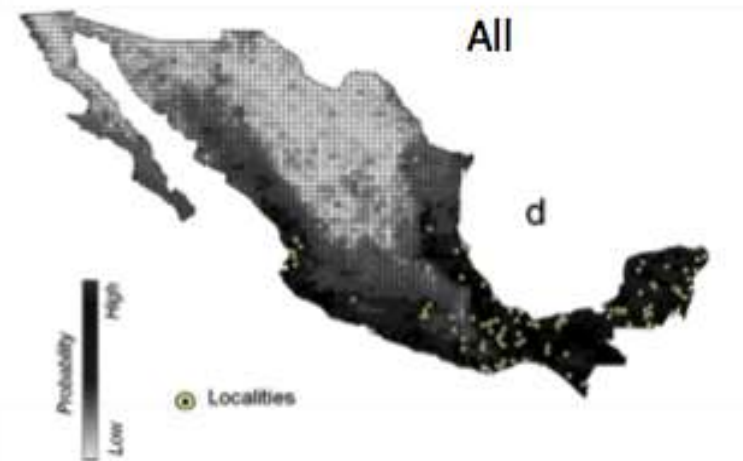
Model performance as a function of score decile



# Lutzomyia Risk Maps from Different Niche models



Relatively higher probability to find Lutzomyias in the north of Mexico from the biotic model than the abiotic one. Are Lutzomyias more common in the north of Mexico than previous data or models would suggest?



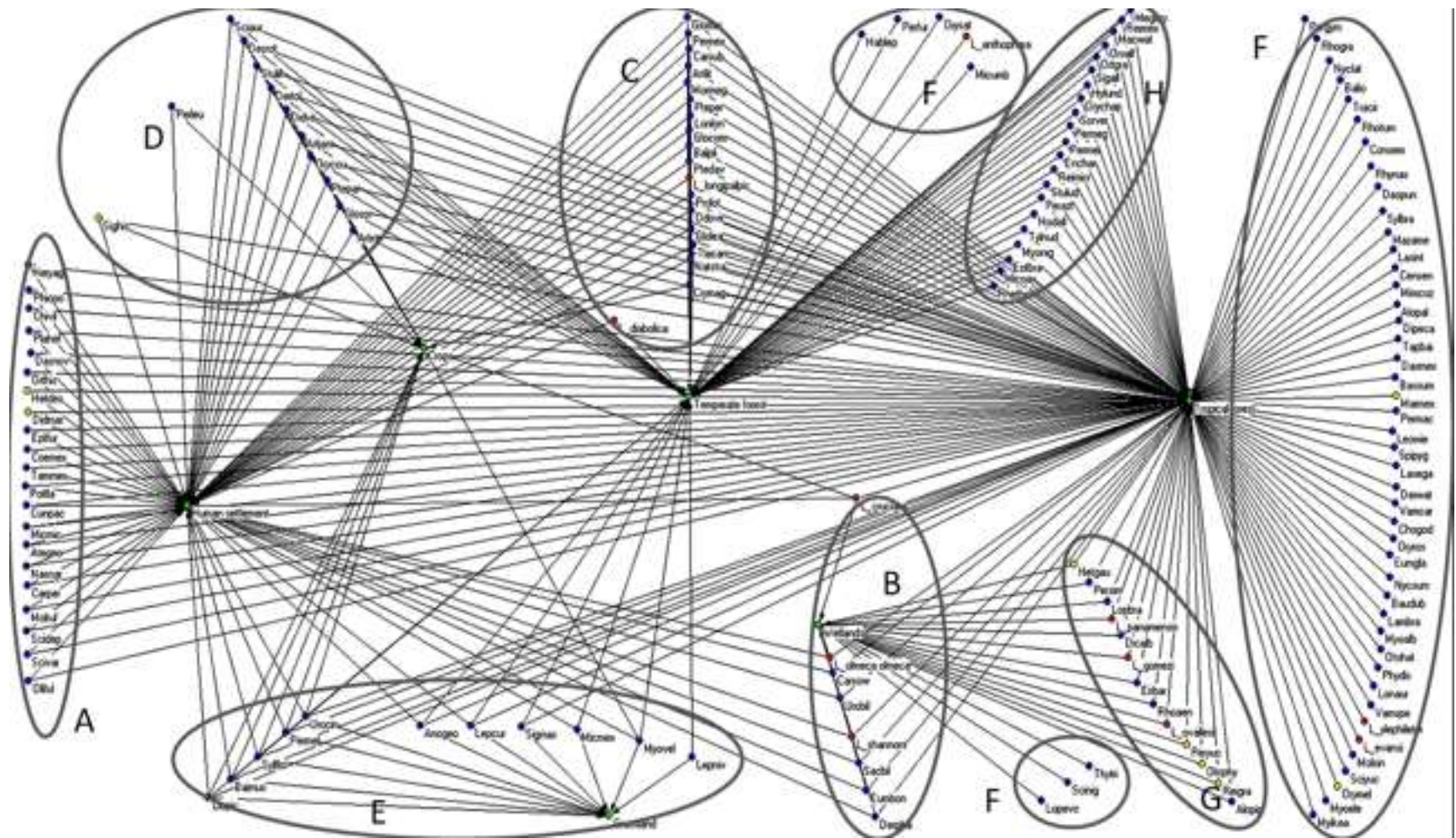
Results: 51 individuals from 5 sites in Nuevo Leon collected from 10 species of Lutzomyia. Also positive resultads from Tamaulipas.

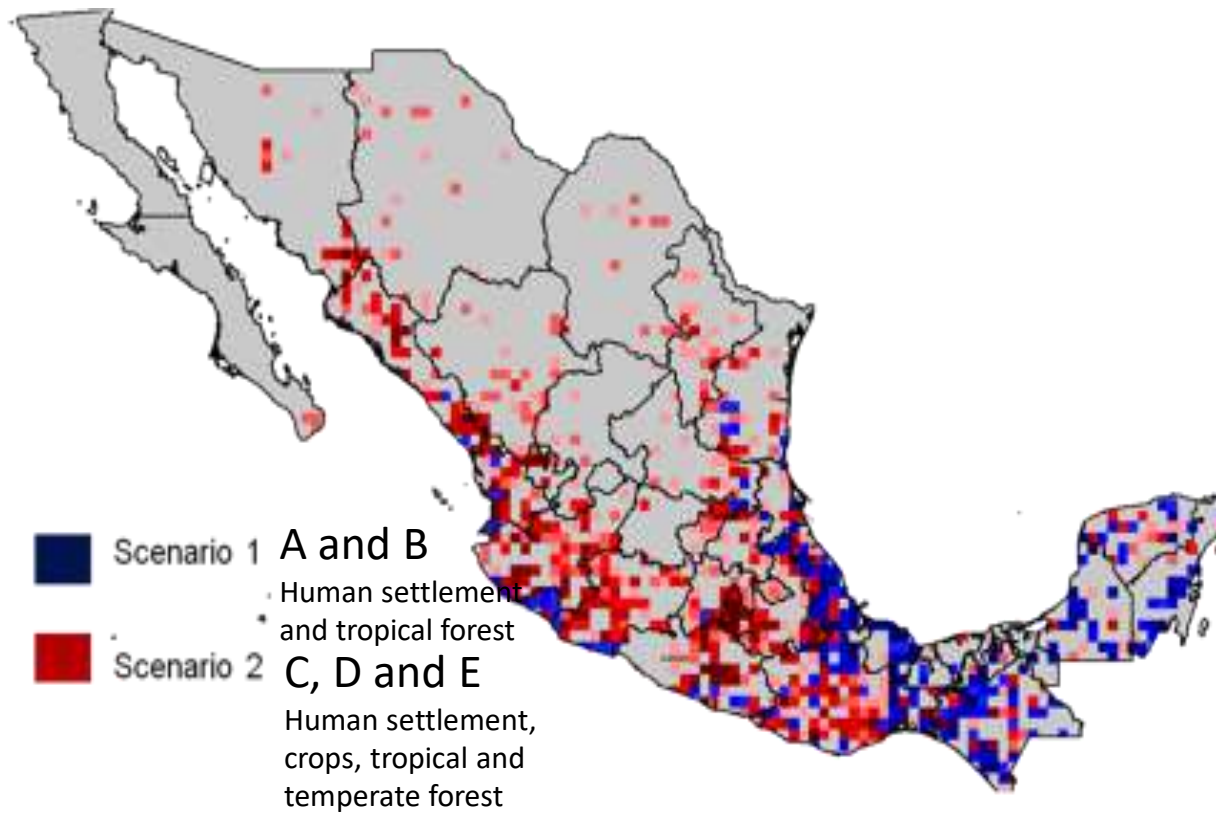
# Lutzomyia Risk Maps from Mammals and Landcover



Biased *Lutzomyia* collections.  
Our modeling indicated that  
there were potential biases.

# Making the Network more complex: Potential patterns of dispersal





- Emerging zoonoses are complex SYSTEMS
  - They are also composed of complex SUB-SYSTEMS
  - Many variables are relevant and the micro and the macro are intimately related
  - Their study requires potentially large, interdisciplinary teams
- We CANNOT do “science” (separate, controlled experiments) to determine the effect of every variable (No PV=RT)
- The world is awash with data
  - Much of this data can be used to (indirectly) infer interactions/relationships/risk factors
  - E.g. Predicting the distribution of *Lutzomyia*, a model with about 500 variables, using point collection data
  - Inference networks are a great way of understanding and visualising potential biotic/abiotic/other interactions
- Modeling at a true systems level IS possible
  - Difference between prediction and understanding

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