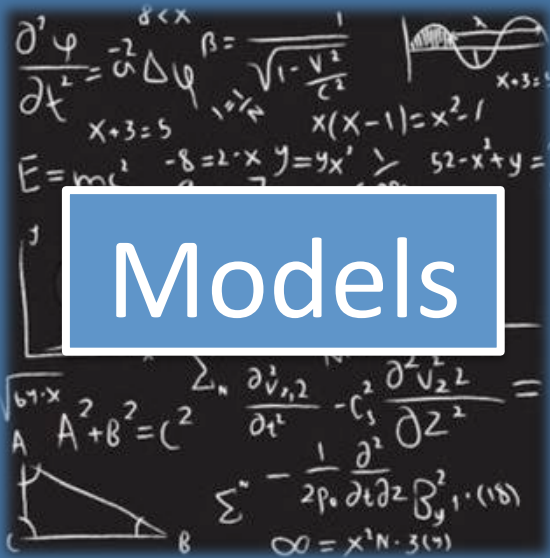


What is Science?



Models

and



Data

Clinic on Dynamical Approaches to Infectious Disease Data

December 15, 2014

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Telling Science as a Story

- Are stories **objective**?
- The importance of a **narrative**
- **Communication**
- But what is Science?

...and that's how we discovered DNA was a double helix, Jimmy.

Tell me another one Mom!



What is Science?

- The Process



- The Body of Knowledge

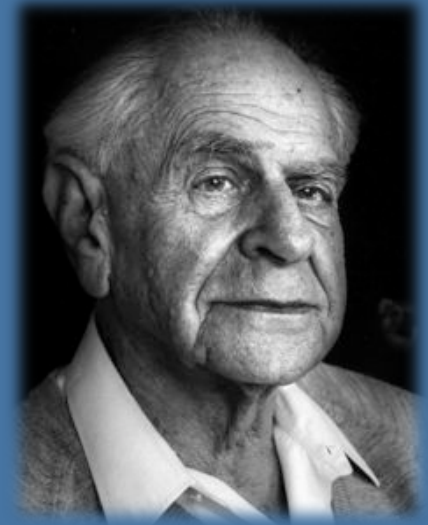


Science as a Process

1. the **systematic observation** of natural events and conditions in order to **discover facts** about them and to **formulate laws and principles** based on these facts.
– *Academic Press Dictionary of Science & Technology*
2. Science alone of all the subjects contains within itself the **lesson of the danger of belief in the infallibility** of the greatest teachers in the preceding generation... I can also define science another way: **Science is the belief in the ignorance of experts.** – *Feynman*

Philosophy of Science

- Karl Popper
Empirical Falsification
- Thomas Kuhn
Subjectivity
Normal Science
Scientific Crises
Paradigm Shifts



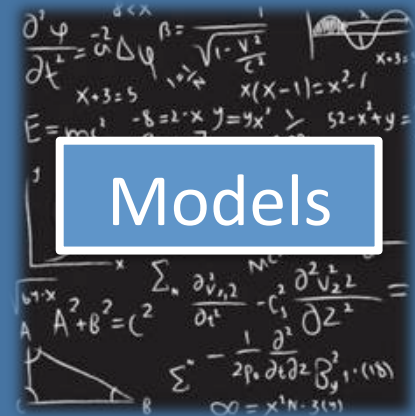
Theory and Observation

- Theory

Explanations

Guesses

Ideas



Models

- Observation

Anecdotes

Expert opinion

Systematic qualitative data

Systematic quantitative data



Data

Theory vs Models

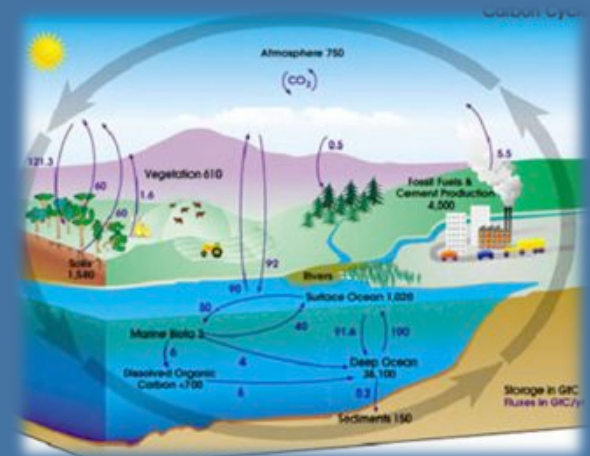
- Theory = set of **statements** that provides an **explanation** of phenomena
 - Logically **complete** & **falsifiable**
- Model = **abstract representation** of phenomena
- Hypothesis = **testable statement** derived from a theory

Types of Models

- Physical



- Conceptual



- Mathematical



$$\frac{\partial}{\partial a} \ln f_{a, \sigma^2}(\xi_1) = \frac{(\xi_1 - a)}{\sigma^2} f_{a, \sigma^2}(\xi_1) = \frac{1}{\sqrt{2\pi\sigma^2}} \exp\left\{-\frac{(\xi_1 - a)^2}{2\sigma^2}\right\}$$
$$\int T(x) \cdot \frac{\partial}{\partial \theta} f(x, \theta) dx = M\left(T(\xi) \cdot \frac{\partial}{\partial \theta} \ln l(\xi, \theta)\right)$$

Models

- When you create a model you are

proposing what you think could be

the most **important things**

to explain an observed phenomenon

Utility of Models



- All models are **wrong** but some are **useful**.
George Box
- Goal of models is to **predict** and to **explain**

Science as a Story

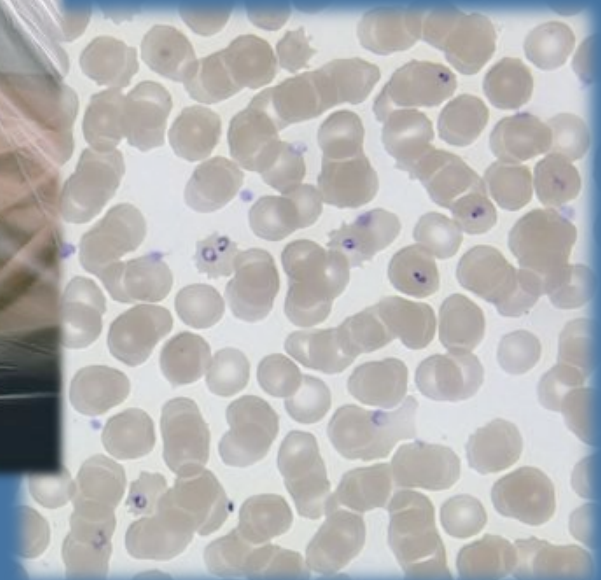
- Are stories **objective**?
- The importance of a **narrative**
- **Communication**
- Story of the **process** or the **body of knowledge**?

...and that's how we discovered DNA was a double helix, Jimmy.

Tell me another one Mom!

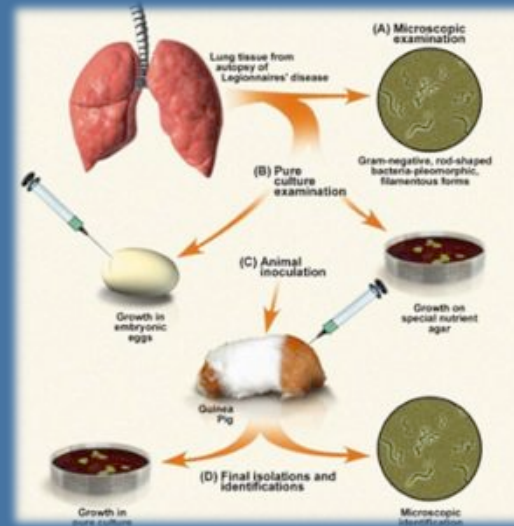
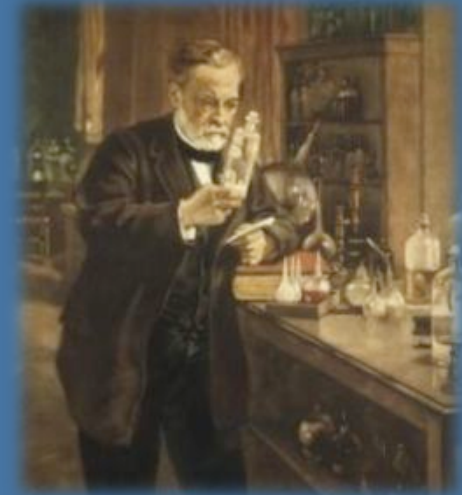


Theory of Mosquito-Borne Transmission



Germ Theory

- Louis Pasteur
- Robert Koch



Koch's postulates in
The Genesis of Germs
Gilken (2007)

Miasmatic **Theory** of Disease

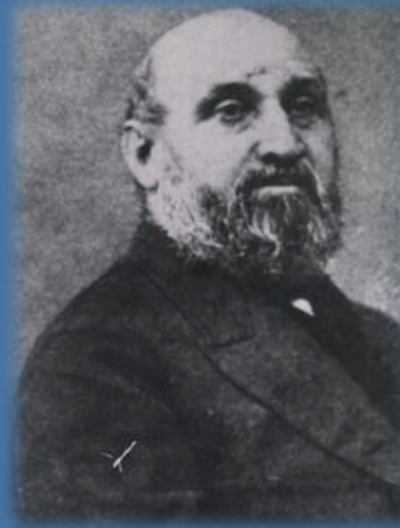
Disease = poisoning by foul emanations from soil, air, water

model



The Black Death as Miasma

Advocates



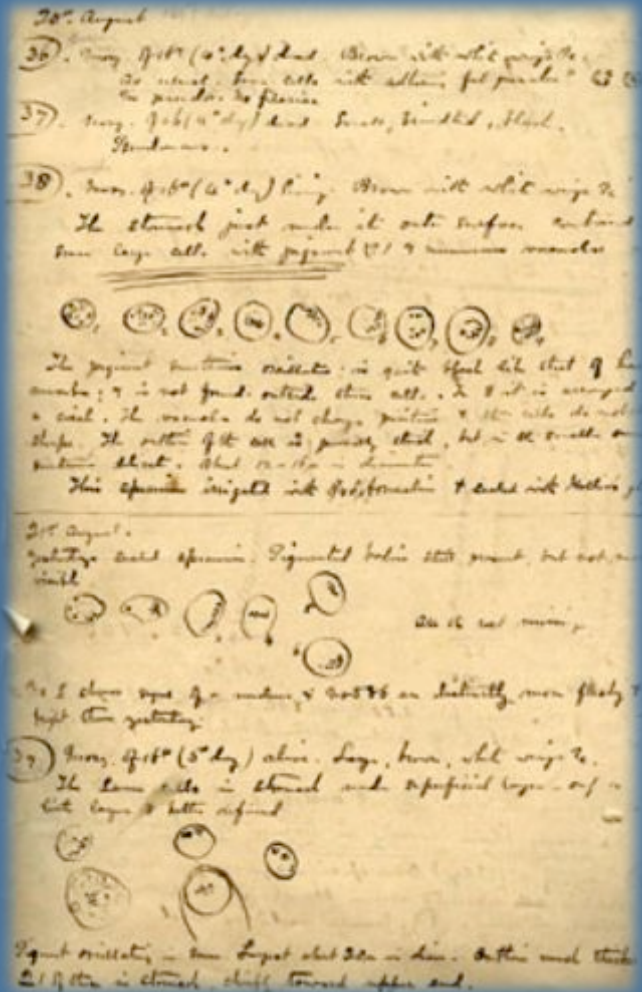
William Farr
1851 London
cholera outbreak



Florence Nightingale

Ronald Ross & Malaria

After 2 years of feeding various insects on malarious patients Ross tried an *Anopheles* sp. and found the infectious life state microscopically.



models and data

Ross' 1897 drawings of *Plasmodium* oocysts

Walter Reed & Yellow Fever

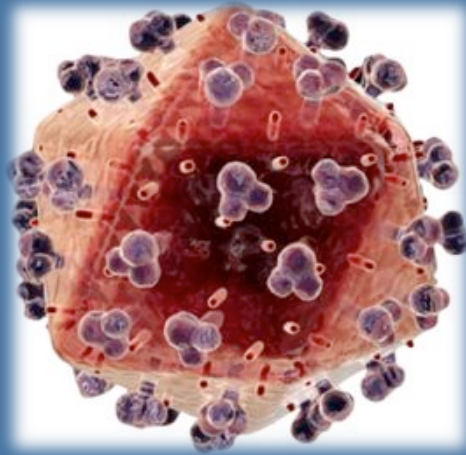
Letter from Walter Reed to
George Miller Sternberg
July 24, 1900

*There is plenty of material
in Havana with every prob-
ability ^{of} its rapid increase
One last case here died on
Monday. We will therefore ex-
pect to transfer our field
of work to military hospital
No. 1 - Lagan, Carroll and
Agronovsk are all deeply
interested in the problem.
Personally, I feel that only
can ~~unlike~~ experimentation
on human beings serve to
clear the field for further
effective work - with one or
two points cleared up, we
could then work to so much
better advantage.*

*With kindest regards
Sincerely yours,
Walter Reed
You check for \$100 was received.*

Credit Am Trop Med Hyg

“Personally, I feel that only can experimentation on human beings serve to clear the field for further effective work -- with one or two points cleared up, we could then work to so much better advantage.”



yellow fever virus

models and data



experimental infections

Theory of Mosquito-Borne Transmission

- So mosquitoes transmit disease...
- But **what aspects** of mosquito biology **are most important** in determining disease burden?

Population density?

Mosquito lifespan?

Bite rate?

Mosquito movement?

Reproduction?

Can these inform effective interventions?

Ross' *A Priori* Pathometry

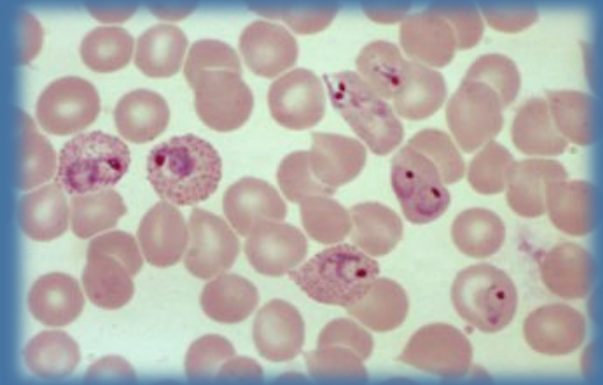
“what percentage of diminution in mosquito-borne disease may be expected to follow a given percentage reduction in the number of mosquitoes?”



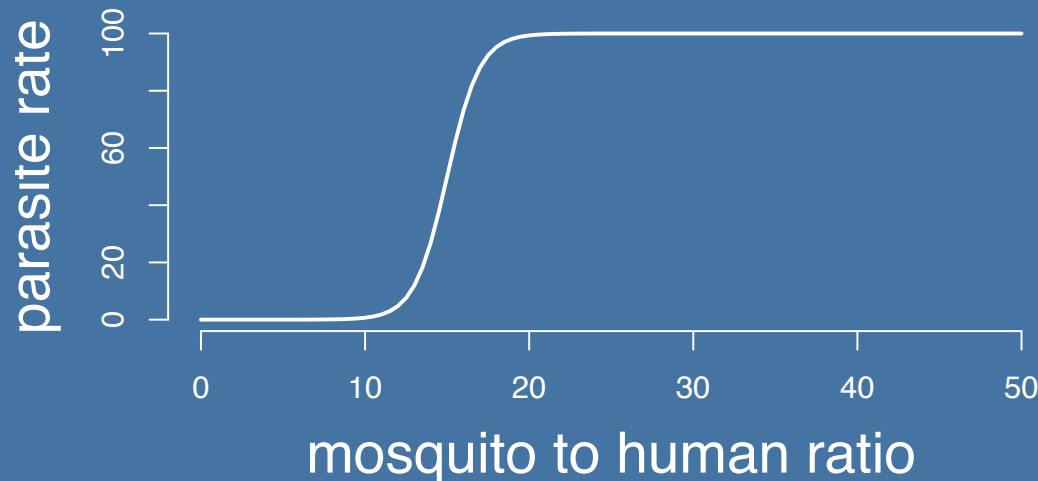
Anopheles quadrimaculatus larvae

Stimulation of Empirical Research: Quantifying transmission

- Parasite Rate



- “Happenings” and the force of infection



Ross Model of Malaria Transmission

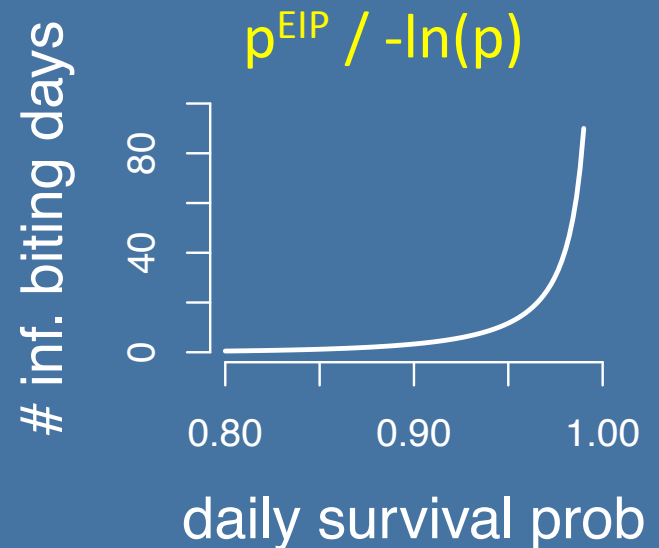
- causal relationship between the **ratio of mosquitoes to humans** & # infected humans
- **unnecessary to kill every mosquito** to end transmission

Mosquito Longevity

- George MacDonal, DDT & Global Malaria Eradication Program (1955-1969)

- Mosquito Survival

Transmission depends on their ability to survive **extrinsic incubation period** & **life expectancy thereafter**

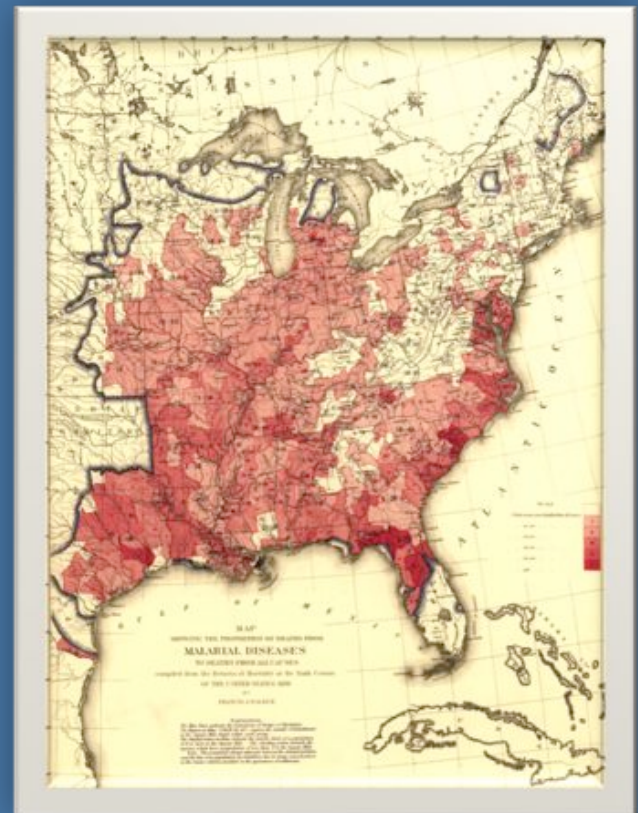


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What was the point of this story?

- Successive discoveries by testing ideas (**models**) against observations (**data**)
- Models drive empirical developments and vice versa
- Complicated relationships required **mathematization** of models

Statistical Models

- Account for bias and random error to find **correlations** that may imply causality.
- Often the first step to assessing relationships.
- Assume **independence** of individuals (at some scale).

Dynamical Models

- Systems Approach: Explicitly model multiple **mechanisms** to understand their interactions.
- Links observed relationships at different scales.
- Explicitly focuses on **dependence** of individuals

Questions in Epidemiology

Statistical Models

- Is HIV status positively associated with the risk of TB infection?

Dynamic Models

- Based on increased TB risk due to HIV, how much should we expect TB notification rate to increase for a given HIV prevalence?

Questions in Epidemiology

Statistical Models

- Are Insecticide Treated Bednets (ITNs) or Indoor Residual Spraying (IRS) more effective for controlling malaria?

Dynamic Models

- How do we expect the age-distribution of malaria incidence to change after implementing ITNs or IRS?

What is Science? Data and Models

- **Science** is a **systematic process** by which we **construct narratives** (theories) about the world
- **Models** are **abstract representations** of the world, created within this narrative framework
- **Data** and observations allow us to **falsify or assign probabilities to particular models** and narrow down our understanding.

The End