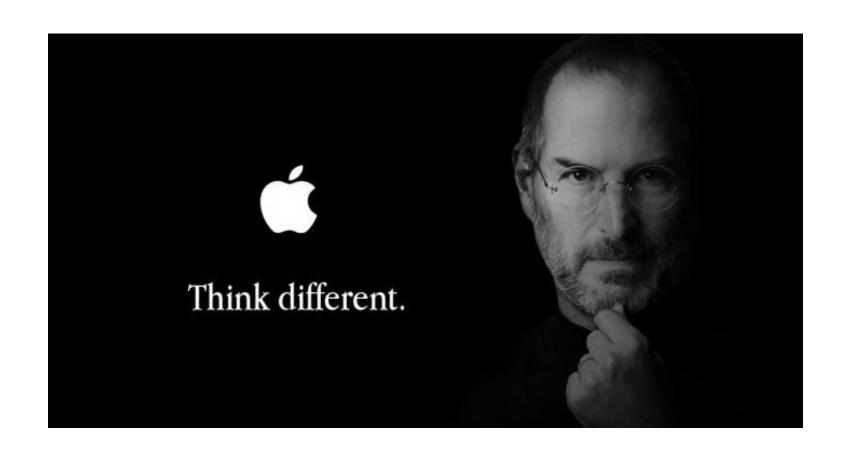
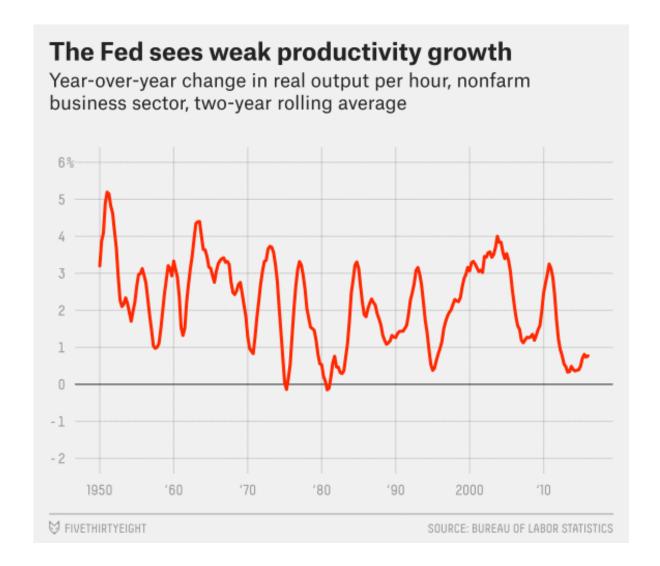
Real time massive online citizen science biodiversity programs: lessons from butterflies

Kathleen Prudic (University of Arizona), Kent McFarland (Vermont Center for Ecostudies), Rebecca Hutchinson (Oregon State University), Jeffrey Oliver (University of Arizona), Jeremy Kerr (University of Ottawa), Maxim Larrivée (Montreal Space for Life) and Elizabeth C. Long (Mohonk Preserve)

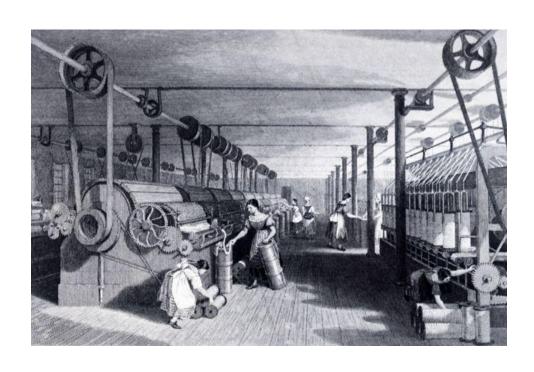
Computers change our world



Computers
have not
increased
productivity



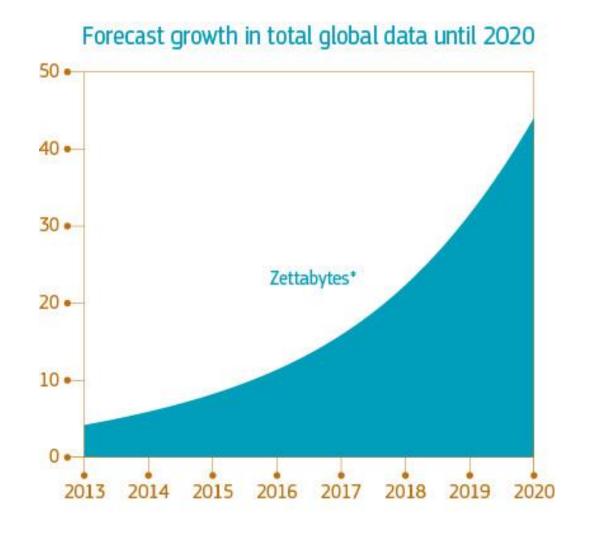
Increasing productivity requires innovation





It took manufacturing over 50 years to figure out how to use electricity to boost US worker productivity http://www.bbc.com/news/business-40673694

90% of the world's data was collected in the past year (Age of Big Data)

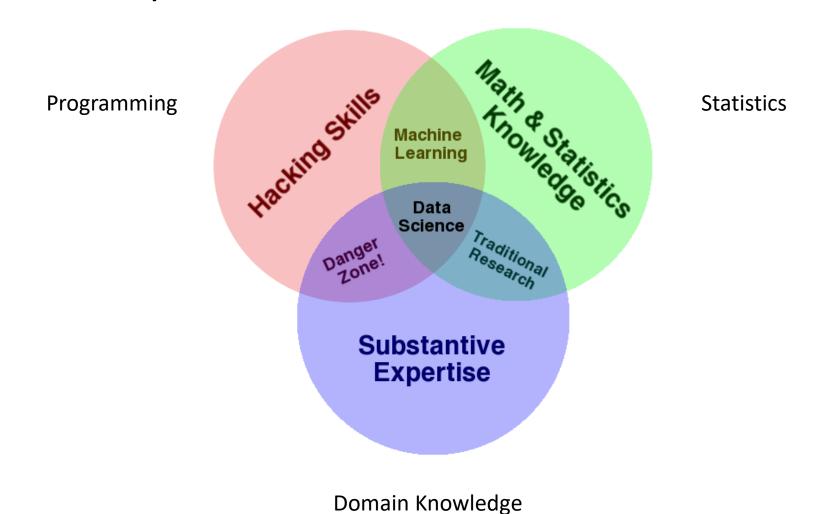


Source: IDC, 2014

 One zettabyte is equal to a billion terabytes, about 12.5 billion 80 gigabyte hard drives Science is about scaling up



Data Science is emerging to tackle big scientific questions with this data



Big Data is changing biodiversity research quickly

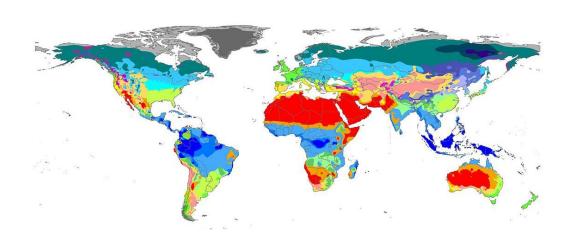


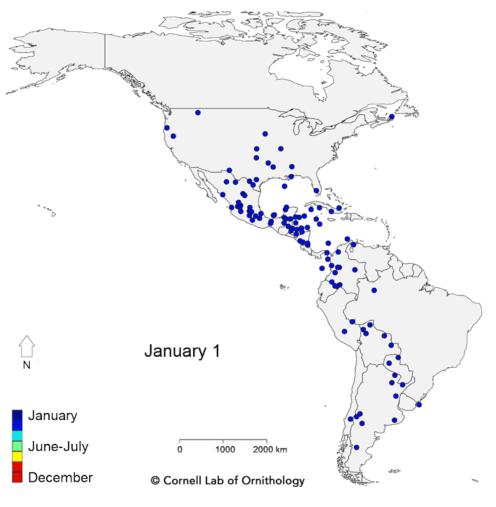


Environmental Sensors

Citizen Science

Both provide huge quantities of data to scale on the cheap

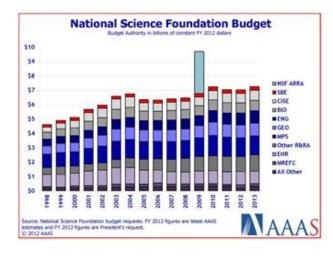


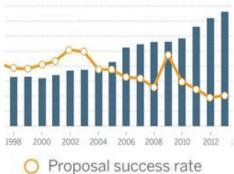


https://www.allaboutbirds.org/mesmerizing-migration-watch-118-bird-species-migrate-across-a-map-of-the-western-hemisphere/

And wow, we need it

Research funding is decreasing



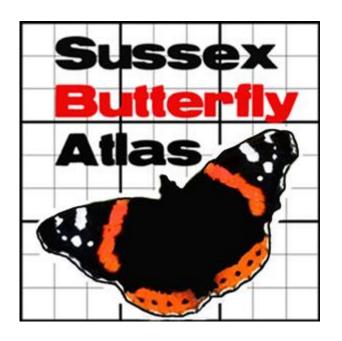


The need for biodiversity data is growing



Historically, biodiversity data has been collected two ways by two different groups

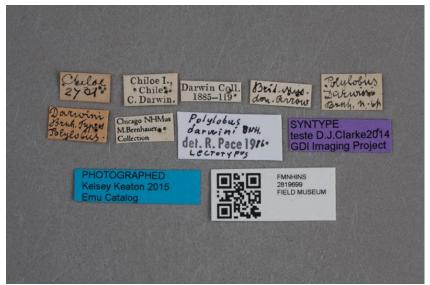




Museum Collections - presence only data

Checklist Surveys - presence/absence data

Some QA/QC challenges as data is aggregated







Inconsistent metadata

Mostly non-digitized

Collection bias

Past may not predict present and future



New web platforms are collecting biodiversity data at unprecedented scale

iNaturalist (https://www.inaturalist.org)







Presence-only data like museums

Presence-absence data like surveys

Collaborate with citizen volunteers

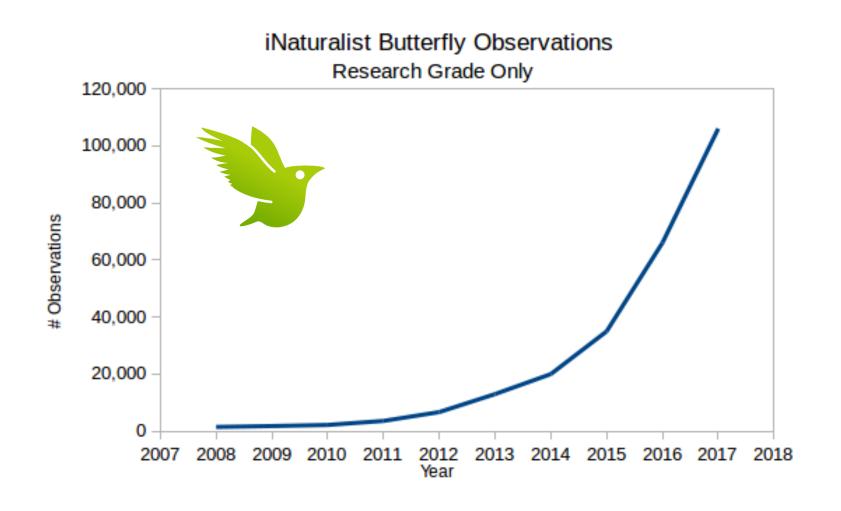


72 million US residents watch wildlife for fun

10 million US residents watch butterflies a minimum of 85 hours a year each

~ \$1,700,000,000 in butterfly volunteer hours a year

Citizen Science data is getting big, and fast!



What do we do with this data?

iNaturalist (https://www.inaturalist.org)



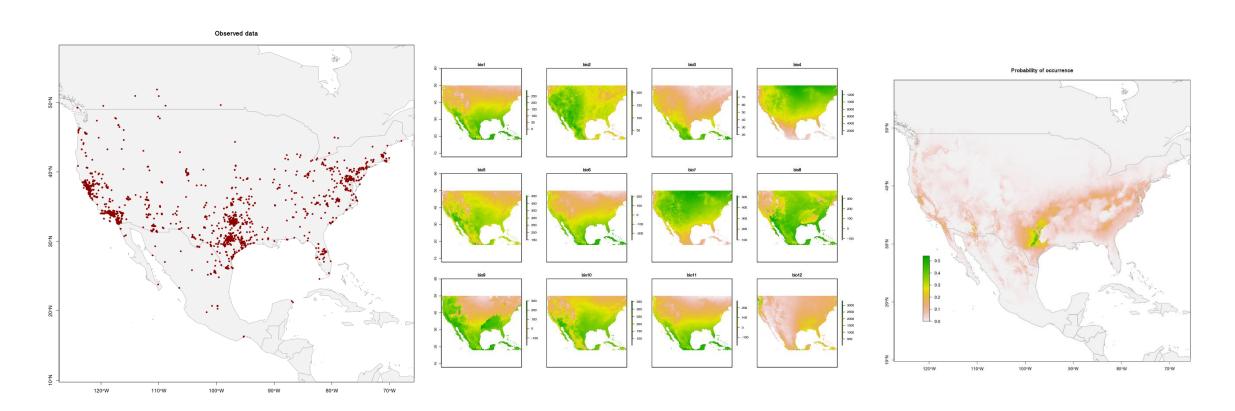
~200,000 North American butterfly records

eButterfly (http://www.e-butterfly.org)



~300,000 North American butterfly records

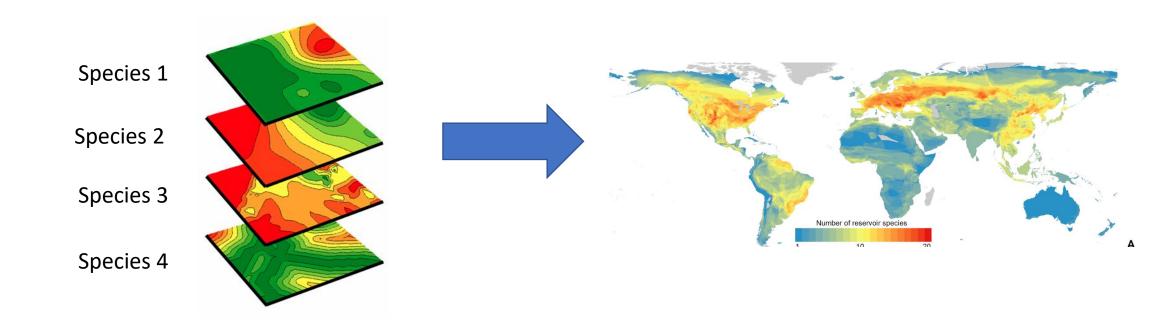
Where do species live?



Annual Species Distribution Map

Where are the biodiversity hotspots?

Biodiversity hotspots can be estimated by combining SDMs



QA/QC problems that impact our analyses at scale



Many Contributors

Participants vary in their ability to identify organisms

Participants vary in their desire to travel

Participants vary in what organisms they like to engage with

Using a Human-Al combination



The core butterfly analytics team!



Rebecca Hutchinson Oregon State University



Jeff Oliver University of Arizona

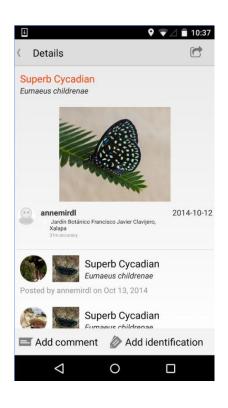


Ben Hickson University of Arizona



Ryan Farrell Brigham Young University

Visual recognition of butterfly photos helps ID



iNaturalist Al suggests IDs



eButterfly uses host data to inform butterfly ID



ID bias is based on expertise



Experts are more likely to mis-ID a common species for a rarer one

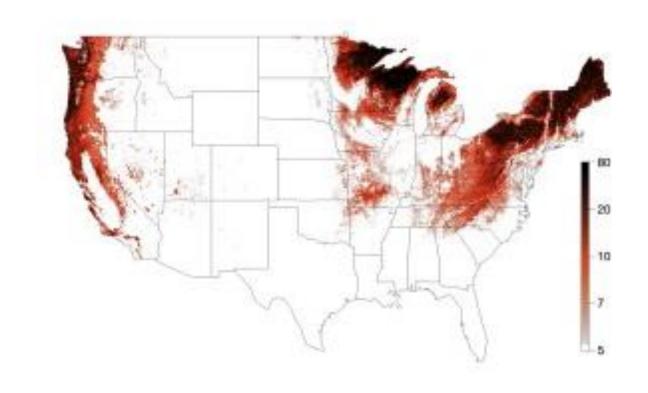


Beginners are more likely to mis-ID a rare species for a common one

Most observations are close to home

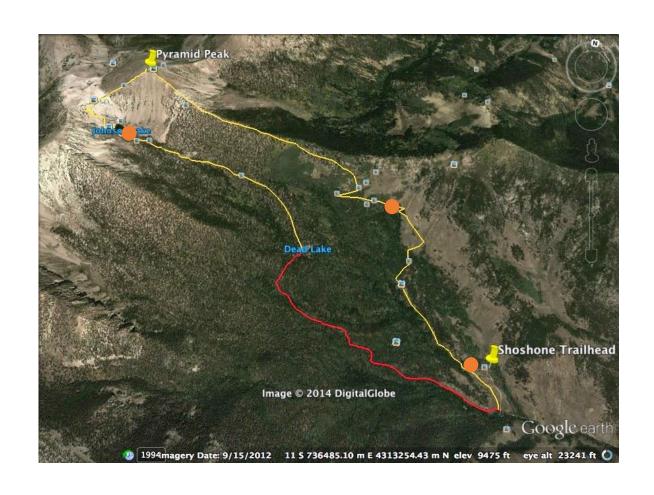


Use models to identify under sampled locations





Use predictive models to generate potential coordinates for butterfly habitats in those areas





Then partner with other groups to sample those locations



Photographs are biased toward larger butterflies





Adding other collection methods such as Malaise traps can help document the small b'flies (BIOSCAN Long et al)

More data is coming

Build processes and tools to increase understanding and conservation of biodiversity in fine scale across continents



Precision conservation!

Many thanks to ...



COLLEGE OF AGRICULTURE & LIFE SCIENCES















