

# LANDSCAPE APPROACHES TRAINING SERIES

## Session 3: Ecosystem Services and Tourism



**THE WORLD BANK**  
Environment, Natural Resources & Blue Economy



**GPS**  
Global Program on Sustainability



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In her current role, Jade acts as a bridge between the science and training teams. With her scientific expertise, she supports capacity building, and connects applications to the resources coming out of the training program. Prior to joining NatCap, Jade worked in collaboration with decision makers, local communities, and NGOs in Hawai'i, Fiji, Vanuatu, and the Solomon Islands to advance science and co-develop place-based tools that can answer their questions. Her research interests lie in bridging land and sea to support people and nature in a changing world.

## learning objectives

- Learn how to apply the InVEST Recreation model and interpret the results.

## about our workshop

This session connects biodiversity to tourism revenue, and demonstrates how the InVEST model can be used to identify places important for tourism, determine what draws tourism to those places, and assess how future management can impact tourism opportunities. The facilitator elaborates on the way InVEST can be used to highlight most visited places, and the features that make those places popular among tourists.

**Keywords:** InVEST, biodiversity, tourism, Photo-User Days, wildlife

# InVEST Tourism Model

JUNE 06, 2022

JADE DELEVAUX

# Outline

- 1/ IDENTIFYING PLACES IMPORTANT FOR TOURISM
  - Overview of the InVEST Tourism model
  - Identifying places important for tourism
- 2/ DETERMINING LANDSCAPE FEATURES THAT DRAW TOURISM
  - Examining tourism input data layers
  - Running the InVEST model on baseline conditions
- 3/ ASSESSING THE EFFECT OF MANAGEMENT ON TOURISM
  - Incorporating scenarios into the tourism model
  - Running the InVEST model on future conditions
- 4/ DISCUSSION: INCORPORATING WILDLIFE INFORMATION IN THE INVEST TOURISM MODEL

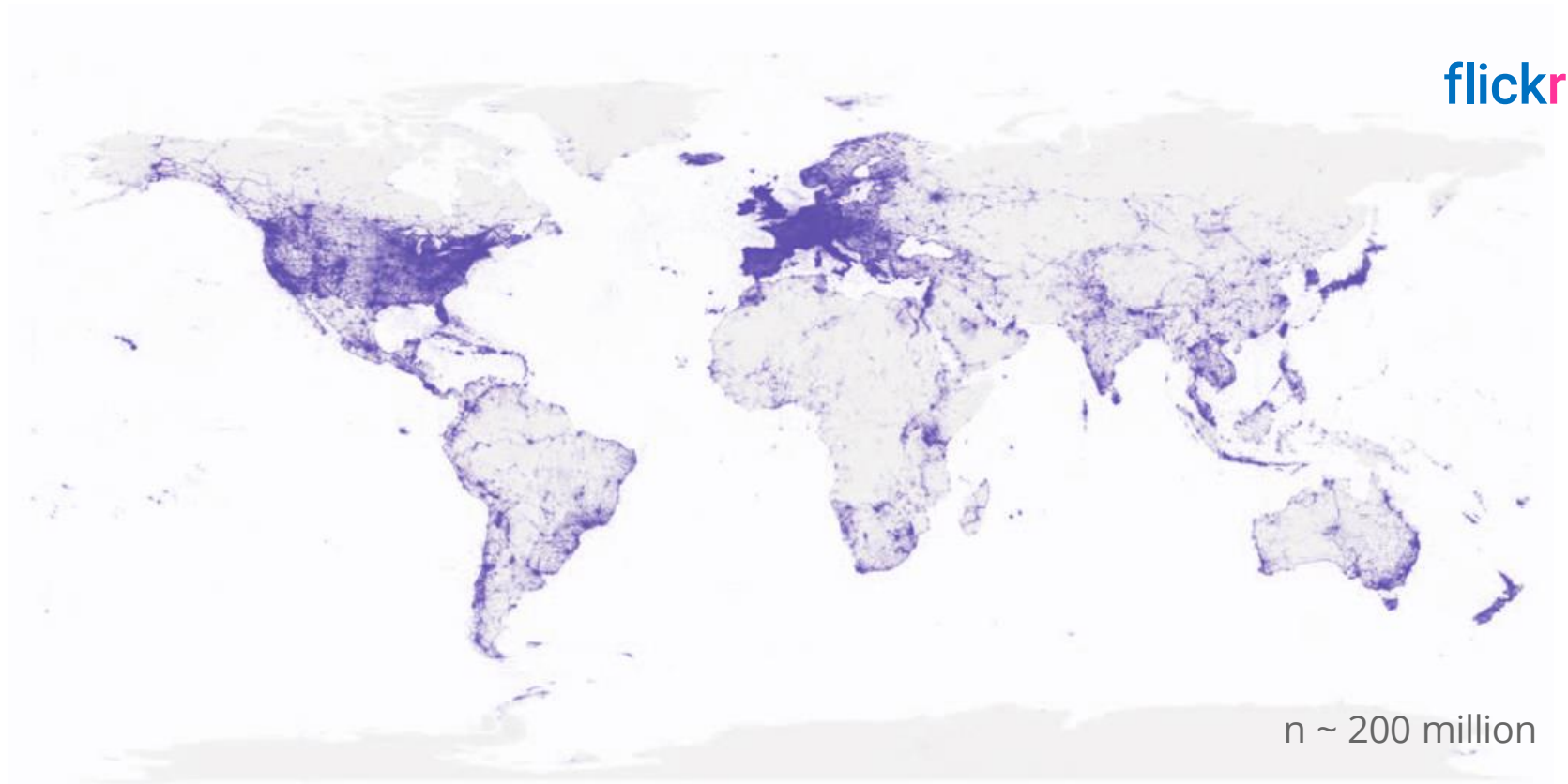


1/ WHERE ARE PEOPLE VISITING ACROSS A LANDSCAPE?  
(WHICH PLACES ARE MOST IMPORTANT FOR TOURISM?)

2/ WHAT FEATURES OF THE LANDSCAPE ARE DRAWING  
TOURISTS?

3/ HOW MIGHT MANAGEMENT ACTIONS AFFECT FUTURE TOURISM?

# Where are people visiting?



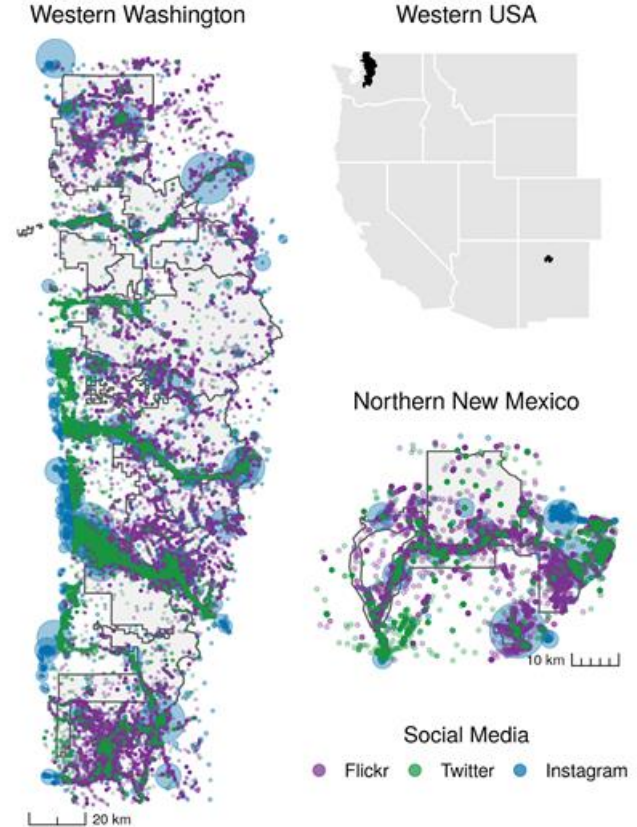
flickr

n ~ 200 million

# Geolocated social media follows visitation patterns

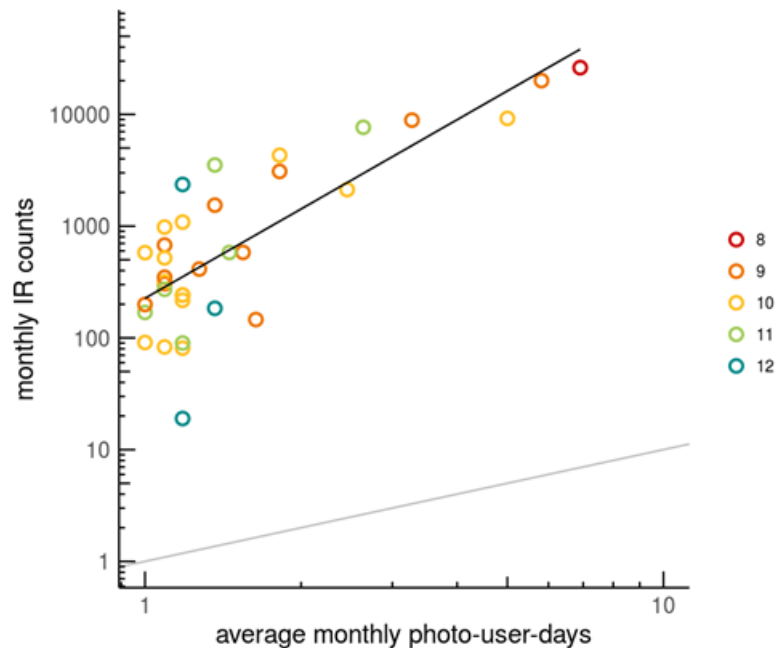
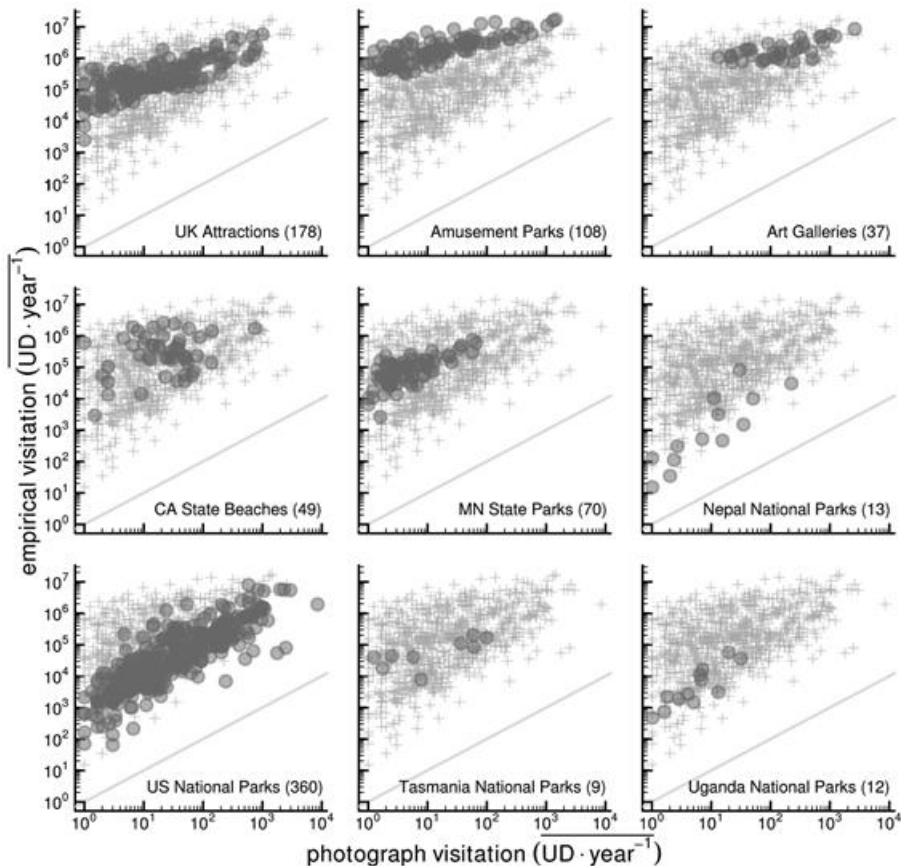
## PHOTO USER-DAYS (PUDs)

- FLICKR METADATA INCLUDES
  - Photo Lat/Long
  - Date photo was taken
  - User ID
- CALCULATE UNIQUE USERS PER DAY WITHIN A DEFINED AREA

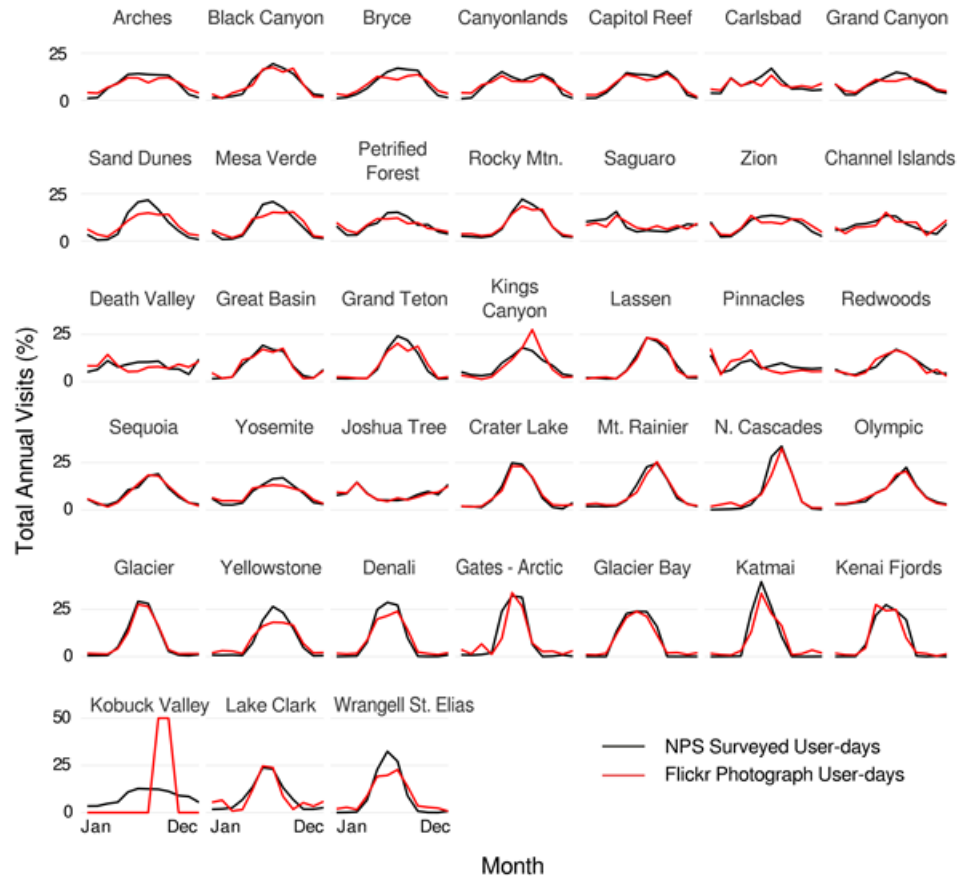


Purple points are Flickr posts (Wood et al. 2020)

# Strong relationship between PUD and empirical visitation data

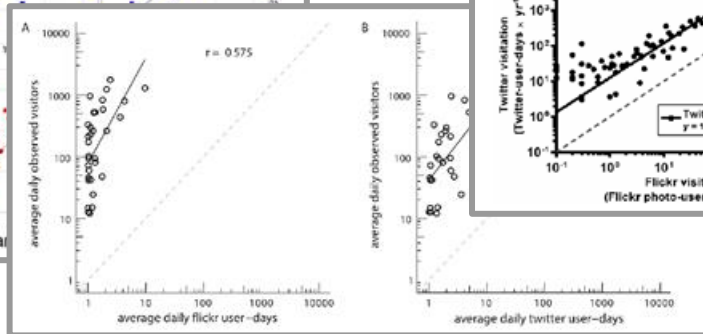
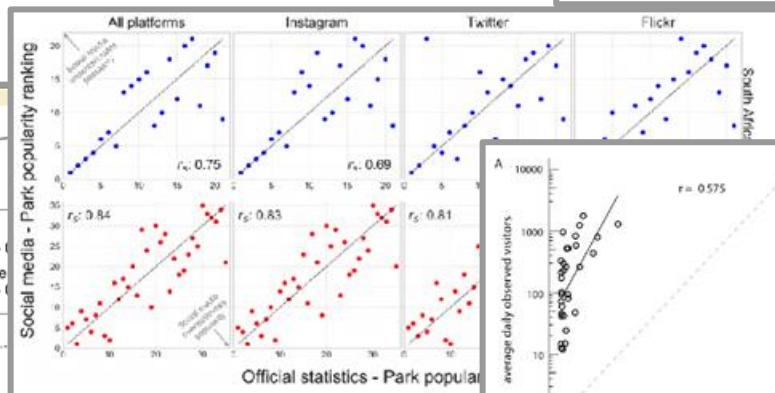
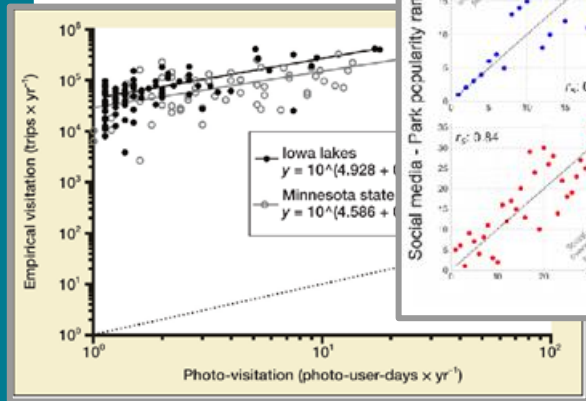
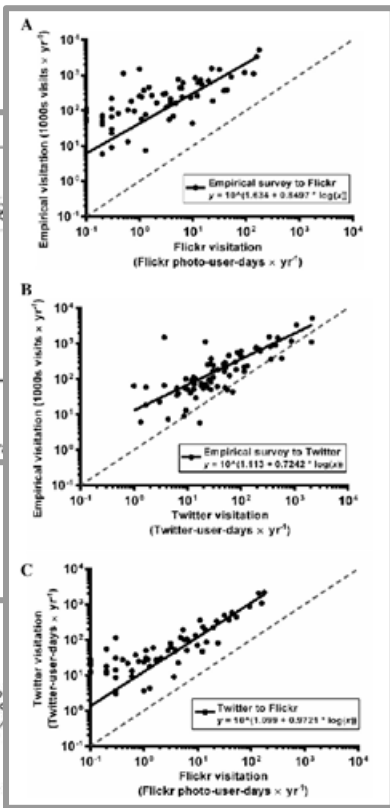
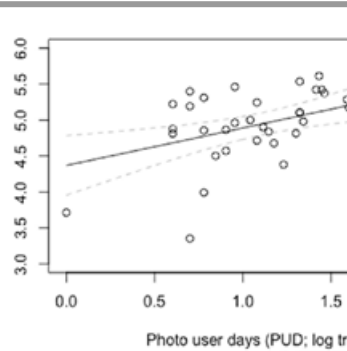
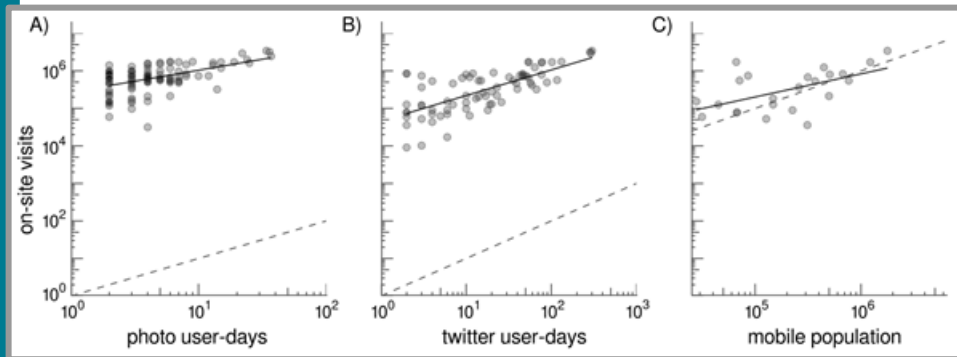


# Geolocated social media - Seasonal trends

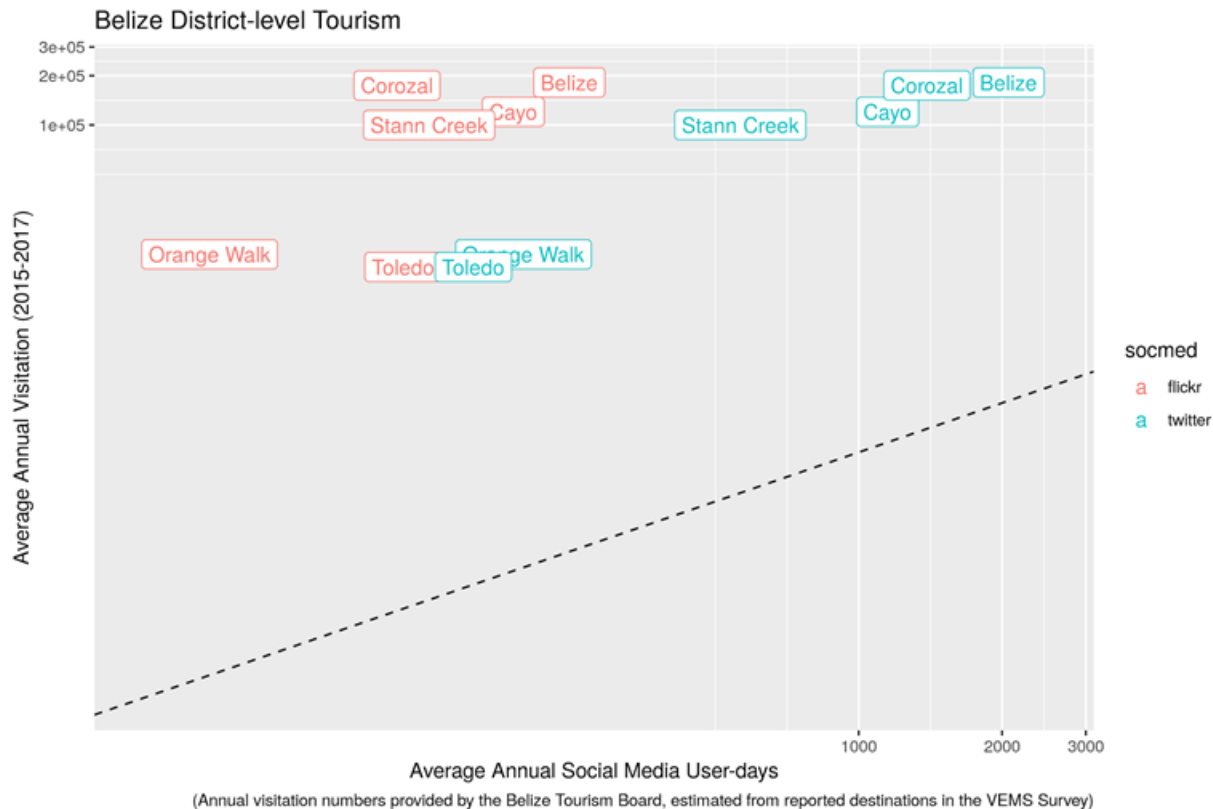




# Geolocated social media



# Geolocated social media - Belize Districts



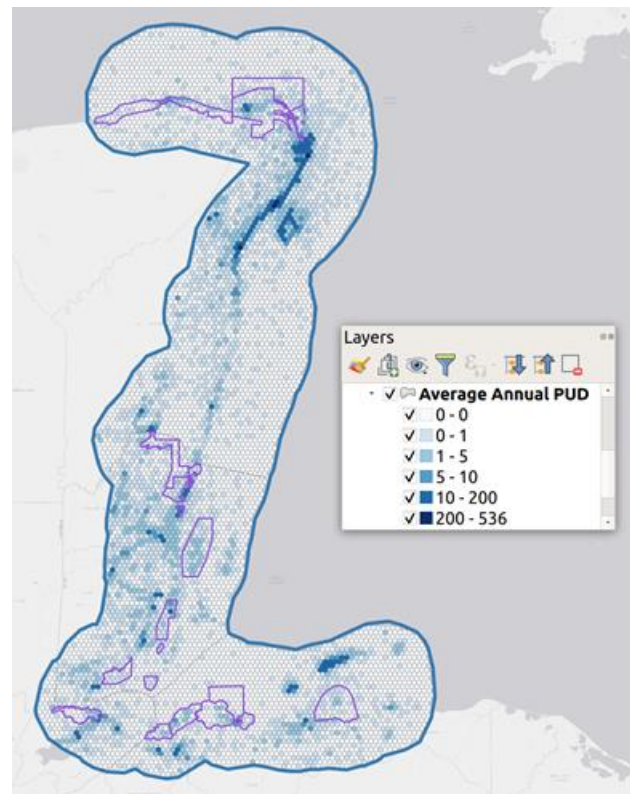
# InVEST Tourism Model – Step 1

CALCULATES THE **AVERAGE NUMBER OF FLICKR PHOTO USER-DAYS (PUD) PER YEAR** ACROSS THE LANDSCAPE

- GRID CELLS OR USER-DEFINED POLYGONS
- AVERAGE ANNUAL PUD (2005-2017)
  - Average Monthly PUD also an option

TELLS YOU ABOUT THE **SPATIAL PATTERNS** OF VISITATION

PRIMARY OUTPUT OF INVEST STEP 1: ONLY REQUIRES AN AOI!



# Step 1 - Calculate PUD in InVEST

Recreation Model: loaded from autosave

InVEST version 3.7.0 | [Model documentation](#) | [Report an issue](#)

- ✓ Workspace:
- Results suffix (optional):
- ✓ Area of Interest (Vector):
- ✓ Start Year (inclusive, must be >= 2005):
- ✓ End Year (inclusive, must be <= 2017):

Compute Regression

Grid the AOI

- Grid Type:
- ✓ Cell Size:

Run

I recommend always using 2005 - 2017

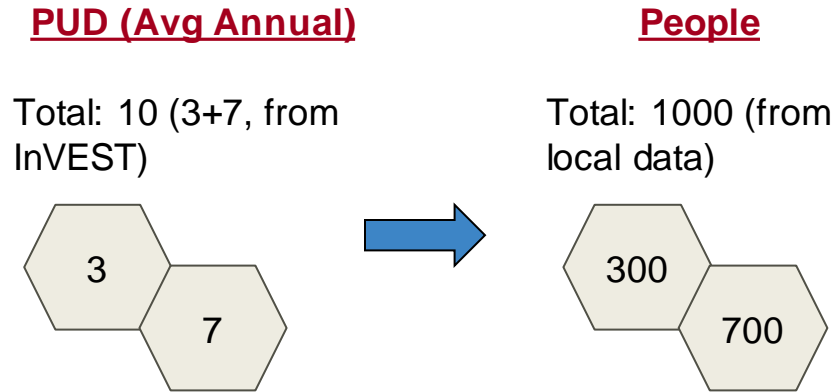
Units match the projection of your AOI

## Step 1 – InVEST model outputs

- LOG FILE (RECORDS YOUR INPUTS, AND ALSO ANY ERRORS)
- PUD\_RESULTS.SHP
  - Shapefile of Photo User-Days (PUD) across the landscape
  - PUD\_YR\_AVG = average annual PUD
  - Often requires a few tries to figure out how to display it well
- MONTHLY\_TABLE.CSV
  - Total PUD per month for every grid cell

# Getting from PUD to People (outside InVEST)

- REQUIRES ON-SITE DATA ABOUT THE TOTAL NUMBER OF VISITORS TO THE REGION
- USES THE PROPORTION OF PUD FROM EACH GRID CELL TO “SPREAD” THE VISITORS ACROSS THE LANDSCAPE (ASSUMES PROPORTION PUD = PROPORTION TOURISTS)





1/ WHERE ARE PEOPLE VISITING ACROSS A LANDSCAPE?  
(WHICH PLACES ARE MOST IMPORTANT FOR TOURISM?)

2/ WHAT FEATURES OF THE LANDSCAPE ARE DRAWING  
TOURISTS?

3/ HOW MIGHT MANAGEMENT ACTIONS AFFECT FUTURE TOURISM?

# What draws people to particular locations?

WHY ARE THERE MORE VISITORS TO SOME PLACES THAN OTHERS?



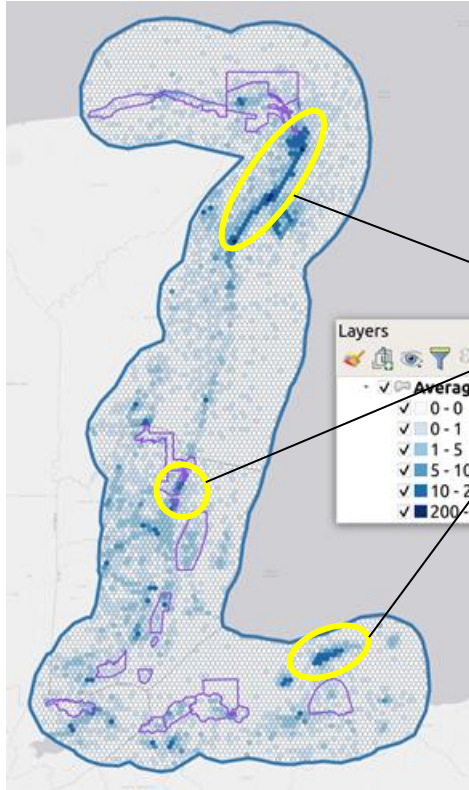
Wat Phra Kaew  
Bangkok, Thailand



Sam Roi Yot Beach  
Thailand



# What draws people to particular locations?



Why are these places tourism "hotspots"?

NATURAL FEATURES?  
CULTURAL FEATURES?  
ACCESS &  
INFRASTRUCTURE?

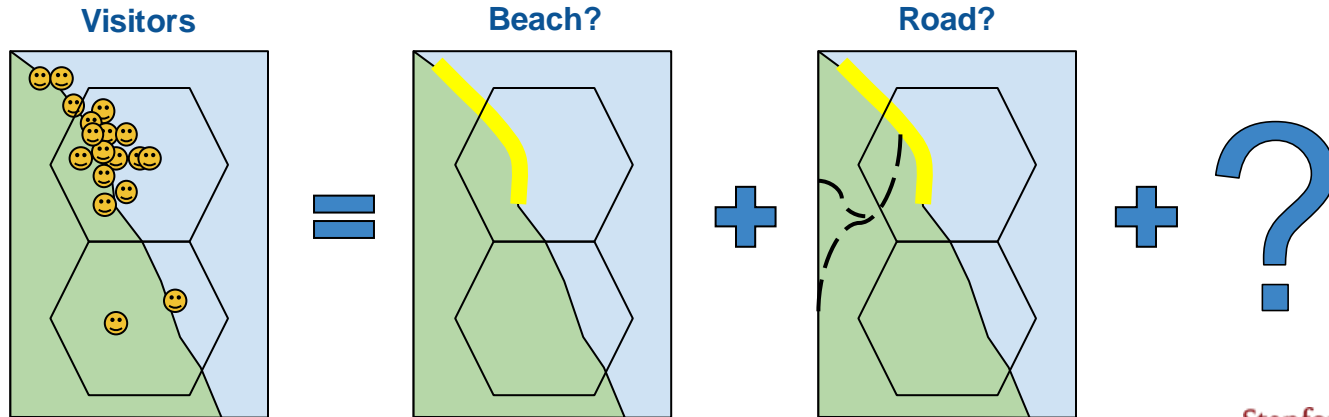
REGION SPECIFIC!

## InVEST Tourism Model - Step 2

THE TOURISM MODEL RELATES THE **NUMBER OF VISITORS (PUD)** TO A SPECIFIC PLACE TO **CHARACTERISTICS** OF THAT PLACE

UNDERLYING THEORY: REVEALED PREFERENCE LINEAR MODEL

- PEOPLE CHOOSE TO GO TO DESIRABLE PLACES, SO:  
MORE PEOPLE = MORE DESIRABLE PLACE



# Data Inputs

LANDSCAPE FEATURES (“PREDICTORS”) THAT YOU BELIEVE MAY DRIVE TOURISM IN YOUR REGION

- NATURAL FEATURES
- CULTURAL FEATURES
- ACCESS/INFRASTRUCTURE FEATURES
- OTHERS? REGION SPECIFIC! (WATER QUALITY, GLACIERS, ETC)

GATHER/CREATE SPATIAL LAYERS FOR EACH FEATURE YOU WANT TO INCLUDE. THE LAYERS SHOULD BE AT LEAST AS LARGE AS THE AOI

Beaches



Archaeological sites



Airports & Ports



# Examples of Data Inputs used in the MesoAmerican region

VISITATION = NATURE + CLIMATE + CULTURE + INFRASTRUCTURE

## NATURE:

- BEACHES
- CORALS
- MANGROVES
- **WILDLIFE (SHARKS, WHALES, FLAMINGOS, TURTLES, MANATEES)**
- FORESTS

## CLIMATE:

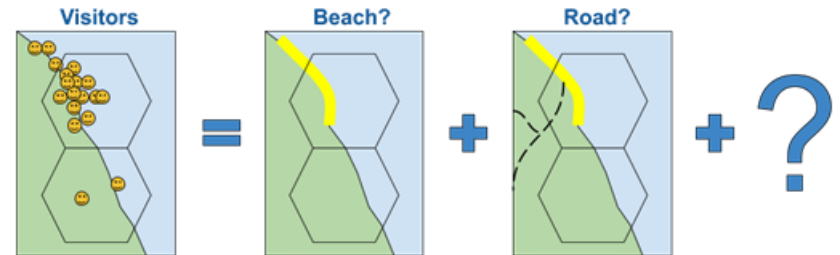
- TEMPERATURE (AVERAGE)
- # OF DAYS OF EXTREME HEAT (> 35C)
- RAINFALL (AVERAGE)

## CULTURE:

- ARCHAEOLOGICAL SITES

## INFRASTRUCTURE:

- DISTANCE FROM AIRPORT/PORT
- ROADS
- DEVELOPMENT



# Predictor Table (example)

Tell InVEST how to incorporate each layer by building a “Predictor Table”

Short,  
informative  
name

File name

What to  
calculate per  
grid cell

id	path	type
<b>beach</b>	beach_from_geomorph_MAR_v4_shift_BZ_MX_32616.shp	line_intersect_length
<b>coral</b>	corals_all_32616.shp	polygon_percent_coverage
<b>wildlife</b>	wildlife3_32616.shp	polygon_percent_coverage
<b>ruins</b>	archaeological_sites_combined_32616.shp	point_count
<b>ports_air</b>	ports_air_32616.shp	point_nearest_distance
<b>roads</b>	roads_MAR_clip_32616.shp	line_intersect_length
<b>develop</b>	lulc_developed_national_baseline_32616.shp	polygon_percent_coverage

Save as a .csv  
file, in the same  
folder as your  
predictor files

# Choices for incorporating different types of predictors

Predictor Type	InVEST Choices (What to calculate)	Example
Lines (shapefile)	line_intersect_length	“How many meters of roads are in each grid cell?”
Polygons (shapefile)	polygon_percent_coverage polygon_area_coverage	“What percent of each grid cell includes coral?” “What is the area covered by coral in each grid cell?”
Points (shapefile)	point_count point_nearest_distance	“How many ruins are inside each grid cell?” “How far is it from each grid cell to the nearest airport?”
Raster	raster_sum raster_mean	“How many people live in each grid cell?” “What’s the average rainfall in each grid cell?”

## Step 2 – compute the regression model in InVEST

The screenshot shows the InVEST software interface for a 'Recreation Model'. The title bar indicates it was loaded from an autosave. The interface includes a version number (3.7.0) and links for 'Model documentation' and 'Report an issue'. The main configuration area has several sections:

- Workspace:** A green checkmark is next to the path 'aining/DemoLive\_20200602/BZ\_run\_20200602'. There is a folder icon to the right.
- Results suffix (optional):** An empty text field with an information icon to the right.
- Area of Interest (Vector):** A green checkmark is next to the path '2\_Data/Belize\_AOI/T\_AOI\_v3\_Belize\_32616.shp'. There is a file icon and an information icon to the right.
- Start Year (inclusive, must be >= 2005):** The value '2005' is entered in the text field. There is an information icon to the right.
- End Year (inclusive, must be <= 2017):** The value '2017' is entered in the text field. There is an information icon to the right.
- Compute Regression:** This section is circled in red. It has a checked checkbox. Below it:
  - Predictor Table:** A green checkmark is next to the path 'T\_Data\_QGIS/InVEST\_inputs/PredsTable\_BZ.csv'. There is a file icon and an information icon to the right.
  - Scenario Predictor Table (optional):** An empty text field with a file icon and an information icon to the right.
- Grid the AOI:** This section has a checked checkbox. Below it:
  - Grid Type:** A dropdown menu is set to 'hexagon'.
  - Cell Size:** A green checkmark is next to the value '5000'. There is an information icon to the right.

A 'Run' button with a play icon is located at the bottom right of the configuration area.

The predictor table tells InVEST where to find your predictors and what to do with them

## Step 2 – InVEST Model output

STATISTICAL RELATIONSHIP BETWEEN EACH FEATURE YOU CHOOSE AND TOURISM (AS REPRESENTED BY PHOTO USER-DAYS (PUD))

- LINEAR MODEL:  $\text{LOG(PUD)} = \text{PREDICTOR 1} + \text{PREDICTOR 2} + \dots$

```
regression_coefficie
*****
          estimate      stderr      t value
(Intercept) +2.606e-01 +1.530e-02 +1.703e+01
wildlife    +2.366e-03 +4.312e-04 +5.487e+00
develop    +4.774e-02 +3.217e-03 +1.484e+01
beach      +1.013e-04 +7.068e-06 +1.433e+01
coral      +1.892e-02 +2.203e-03 +8.589e+00
ports_air  -5.890e-06 +4.936e-07 -1.193e+01
roads      +3.508e-05 +6.511e-06 +5.388e+00
ruins      +4.383e-01 +6.050e-02 +7.246e+00
-----

Residual standard error: 0.3305 on 2128 degrees of f
Multiple R-squared: 0.3948
Adjusted R-squared: 0.3928
SSres: 232.4849
server id hash: 3.3.2:./recserver_cache_2017/76e890d:
*****
```

- ↑ Wildlife +
- ↑ Development +
- ↑ Beach +
- ↑ Coral +
- ↓ Distance from Airport / Port +
- ↑ Roads +
- ↑ Ruins

Tells you how much people value each feature that you included Stanford University





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TOURISTS?

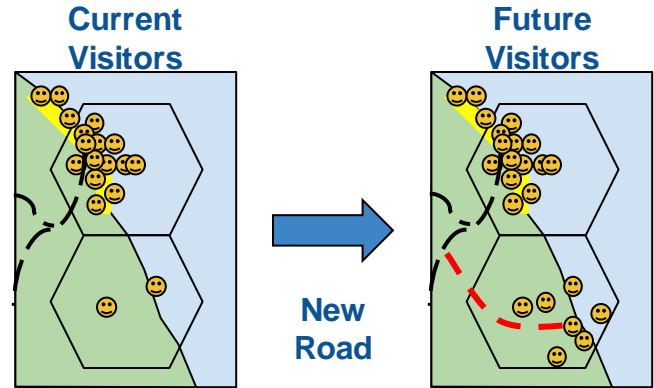
3/ HOW MIGHT MANAGEMENT ACTIONS AFFECT FUTURE TOURISM?

# How might tourism patterns change in the future?

UNDER A SPECIFIC MANAGEMENT ACTION? IF A SPECIES' RANGE CHANGES? UNDER A CHANGING CLIMATE?

USES THE RELATIONSHIPS FOUND IN THE LINEAR MODEL TO PREDICT FUTURE PUD UNDER CHANGED LANDSCAPE FEATURES

EXAMPLE: IF WE INCREASE ACCESS TO A SPECIFIC AREA, HOW WILL TOURISM RESPOND?

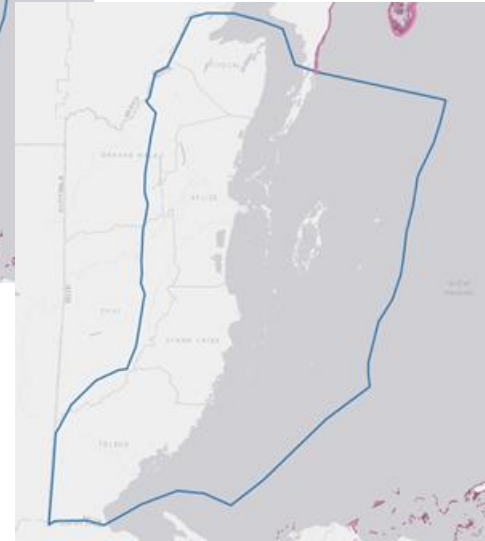
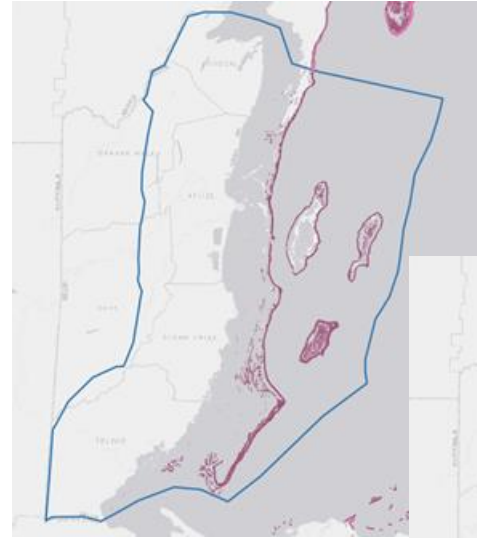


# Scenario Case Study - Protect Belize Coral

*WHAT EFFECT WILL PROTECTING CORAL HAVE ON FUTURE TOURISM?*

CREATE TWO POSSIBLE MAPS OF CORAL IN THE FUTURE

1. CORAL IS PROTECTED, AND CONTINUES TO PERSIST IN ALL THE PLACES IT IS CURRENTLY FOUND
  - a. Coral shapefile does not change
2. CORAL IS NOT PROTECTED, AND DISAPPEARS IN BELIZE
  - a. Create a new shapefile which does not include any coral in Belize



# Scenario Case Study - Protect Belize Coral

CREATE A “SCENARIO PREDICTOR TABLE” FOR INVEST FOR EACH MAP OF CORAL

1. CORAL IS PROTECTED
  - a. Identical to the “Predictor Table” (because the coral map is the same)
2. CORAL IS LOST
  - a. Identical to the “Predictor Table”, but the “path” points to the new coral shapefile

id	path	type
beach	beach_from_geomorph_MAR_v4_shift_BZ_MX_32616.shp	line_intersect_length
coral	MAR_coral_WGS8416N_eraseBelize.shp	polygon_percent_coverage
...	...	...

# Step 3 – Scenario Case Study - Protect Belize Coral

RUN INVEST TWICE. WHAT WILL TOURISM LOOK LIKE IF:

CORAL IS PROTECTED

Recreation Model: loaded from autosave

InVEST version 3.7.0 | [Model documentation](#) | [Report an issue](#)

- ✓ Workspace: recreation/MAR/BZ\_Training/ToShare/ProtectCoral
- ✓ Results suffix (optional):
- ✓ Area of Interest (Vector): 2\_Data/Belize\_AOI/T\_AOI\_v3\_Belize\_32616.shp
- ✓ Start Year (inclusive, must be >= 2005): 2005
- ✓ End Year (inclusive, must be <= 2017): 2017
- ✓ Compute Regression
  - ✓ Predictor Table: T\_Data\_QGIS/InVEST\_inputs/PredsTable\_BZ.csv
  - ✓ Scenario Predictor Table (optional): T\_Data\_QGIS/InVEST\_inputs/PredsTable\_BZ.csv
- ✓ Grid the AOI
  - Grid Type: hexagon
  - ✓ Cell Size: 5000

Run

CORAL IS LOST

Recreation Model: loaded from autosave

InVEST version 3.7.0 | [Model documentation](#) | [Report an issue](#)

- ✓ Workspace: recreation/MAR/BZ\_Training/ToShare/LoseCoral
- ✓ Results suffix (optional):
- ✓ Area of Interest (Vector): 2\_Data/Belize\_AOI/T\_AOI\_v3\_Belize\_32616.shp
- ✓ Start Year (inclusive, must be >= 2005): 2005
- ✓ End Year (inclusive, must be <= 2017): 2017
- ✓ Compute Regression
  - ✓ Predictor Table: T\_Data\_QGIS/InVEST\_inputs/PredsTable\_BZ.csv
  - ✓ Scenario Predictor Table (optional): QGIS/InVEST\_inputs/PredsScenario\_LoseCoral.csv
- ✓ Grid the AOI
  - Grid Type: hexagon
  - ✓ Cell Size: 5000

Run

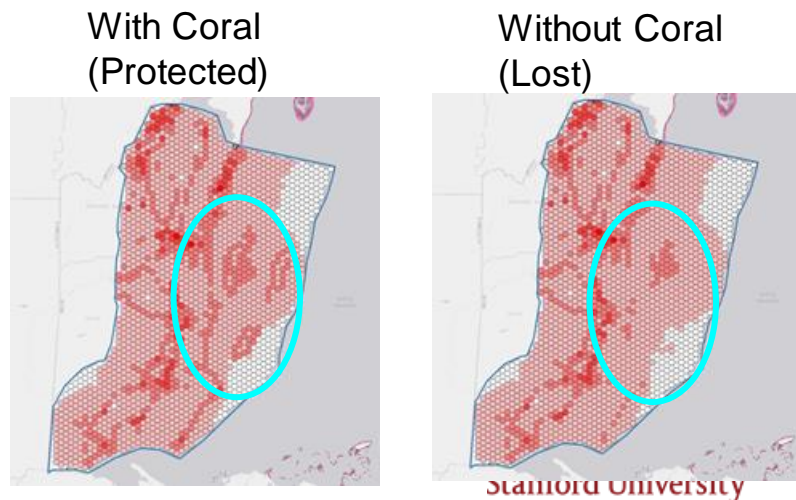
## Step 3 – InVEST model outputs

TWO FOLDERS, EACH WITH A COPY OF: “SCENARIO\_RESULTS.SHP”

- Shows how tourism patterns may look in the future under different management scenarios (PUD\_EST)
- Also includes calculations for each predictor based on the Scenario Predictor Table (can be compared to predictor\_data.shp)

COMPARE PREDICTED TOURISM PATTERNS WITH AND WITHOUT CORAL PROTECTION:

1. OPEN “SCENARIO\_RESULTS.SHP” FROM THE EACH OF THE TWO INVEST RUNS (PROTECTCORAL AND LOSECORAL)
2. DISPLAY THE PUD\_EST COLUMN FOR EACH



# Model Limitations

- RELIES ON FLICKR FROM 2005-2017 TO LEARN ABOUT VISITATION PATTERNS
- NO TEMPORAL ASPECT (USES AVERAGE ANNUAL PUD TO LEARN ABOUT **SPATIAL** PATTERNS)
- DETERMINES THE RELATIONSHIP BETWEEN EACH FEATURE AND TOURISM FOR YOU - CAN'T BE SPECIFIED AHEAD OF TIME
- LIMITED MODEL SPECIFICATION CHOICES

# Discussion: Wildlife & Tourism



# Mapping wildlife and incorporating it into the InVEST model

WILDLIFE CAN BE MAPPED IN 3 PRIMARY WAYS, RANGING FROM SIMPLE FILED SURVEYS TO MORE COMPLEX SPECIES DISTRIBUTION MODELING.

- 1/ LOCATION (PRESENCE/ABSENCE) AND ABUNDANCE (COUNT) OF WILDLIFE WITH THEIR GEOLOCATIONS (POINT DATA).
- 2/ LEVERAGE FIELD DATA AND GEOSPATIAL INFORMATION (LAND COVER, TOPOGRAPHY, CLIMATE) TO GEOGRAPHICALLY EXTRAPOLATE THE LOCATION AND ABUNDANCE OF WILDLIFE DATA. THIS CAN HELP GENERATE CONTINUOUS MAPS OF WILDLIFE DISTRIBUTION.
- 3/ IF DATA ON WILDLIFE DISTRIBUTION AND ABUNDANCE IS NOT AVAILABLE, YOU CAN USE HABITAT MAPS AS PROXY OF PRESENCE/ABSENCE OF WILDLIFE. THIS REQUIRES ECOLOGICAL INFORMATION ABOUT THE SPECIES OF INTEREST. FOR INSTANCE, WHERE SPECIES LIKE TO FORAGE.

# Next steps

IDENTIFY DATA SOURCES ON WILDLIFE  
DISTRIBUTION

DETERMINE OTHER FEATURES THAT CAN DRAW  
TOURISM

MAP THOSE NATURAL AND HUMAN FEATURES

RUN THE INVEST MODEL FOLLOWING THE  
STEPS DESCRIBED IN THIS SLIDE DECK

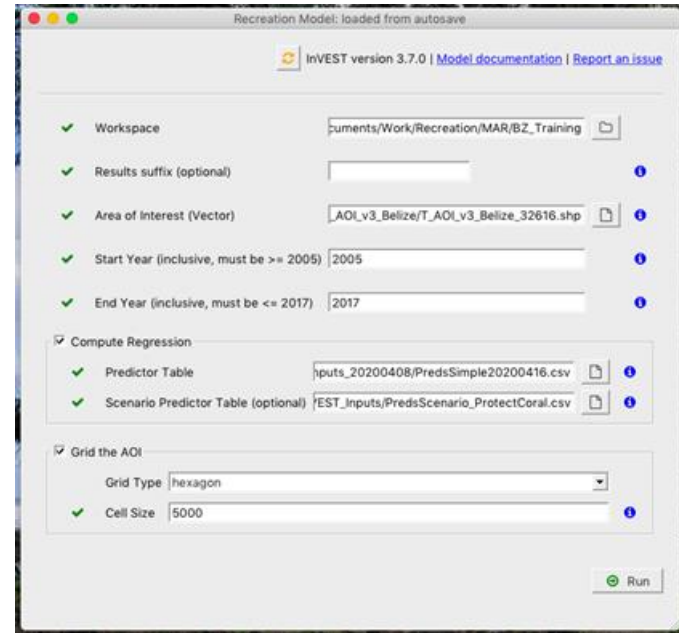
# Resources

INVEST TOURISM MODEL USER GUIDE:

<http://releases.naturalcapitalproject.org/invest-userguide/latest/recreation.html>

NATURAL CAPITAL PROJECT / INVEST FORUM (SOFTWARE AND SCIENCE  
SUPPORT):

<https://community.naturalcapitalproject.org/>



A photograph of a beach with waves crashing onto the shore under a clear blue sky. The text is overlaid on the image.

# Thank you!

JADE DELEVAUX  
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