



InVEST Crop Pollination

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Crop Pollination

- 75% of important crop plants benefit from animal pollination
- Fruits and vegetables, not staple grains or beans
- Service valued at billions of dollars per year globally



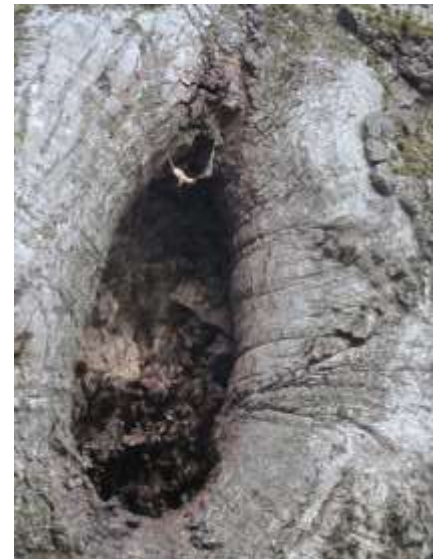
Crop Pollination

Wild bees need:

- Food – pollen, nectar
- Nesting sites - trees, ground

Wild bees provide:

- Increased crop yield and quality
- Food security



Existing models

- No other generic pollination models
- Mostly location- or crop-specific



InVEST Pollination Model

- Focus on wild bees
- *Source abundance* of pollinators across landscape
- *Farm abundance* in agricultural areas
- Pollination value in agricultural areas



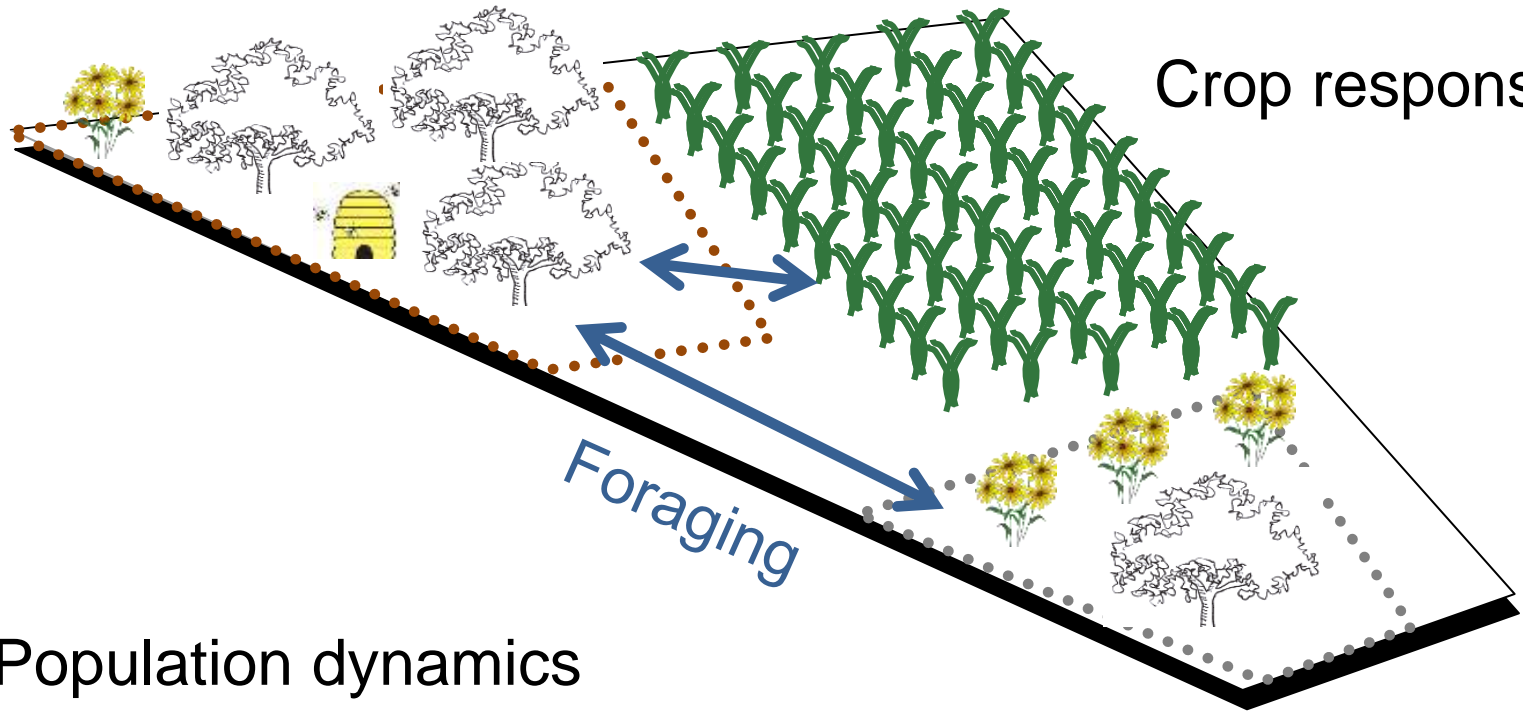
Big picture

Floral resources

Nesting resources

Floral resources

Crop response



+ Population dynamics
of pollinators / plants

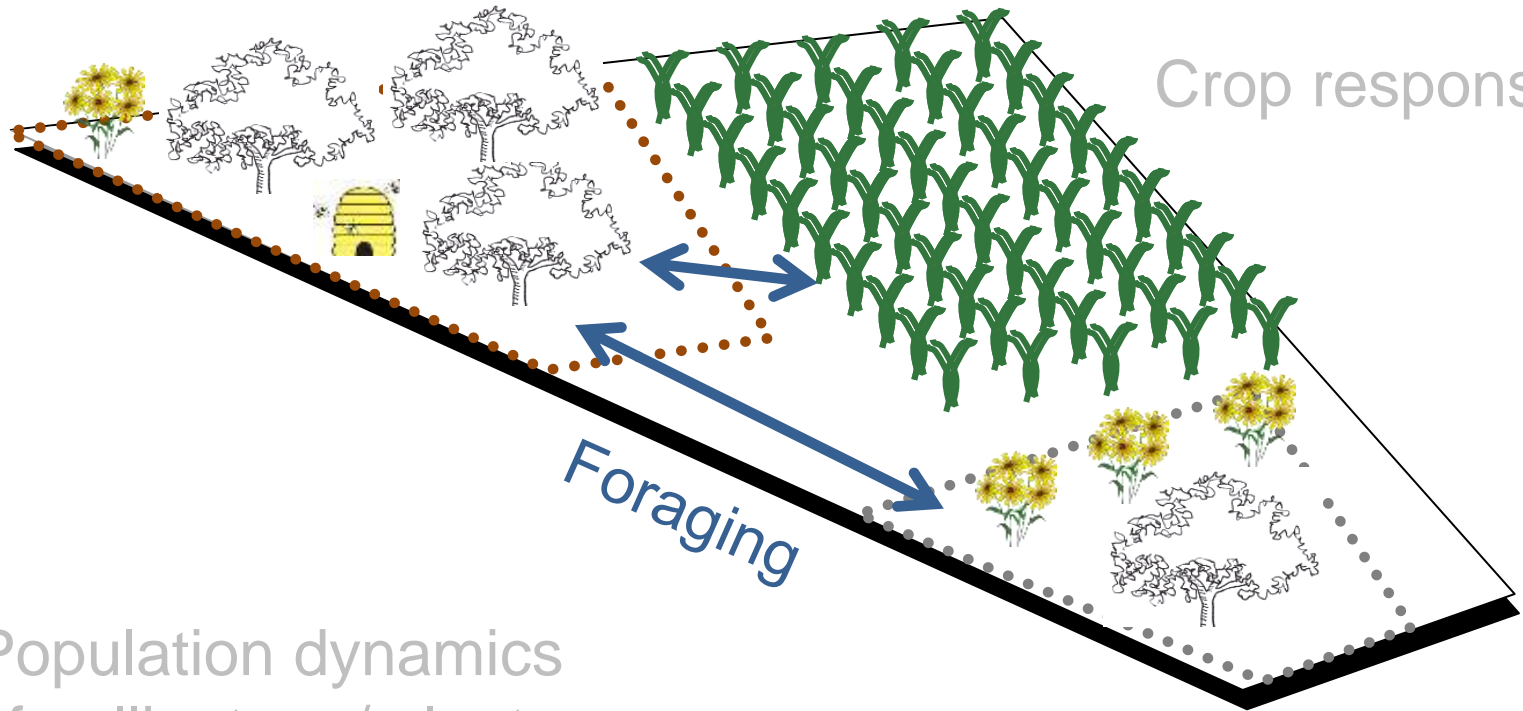
InVEST Pollination Model

Floral resources

Nesting resources

Floral resources

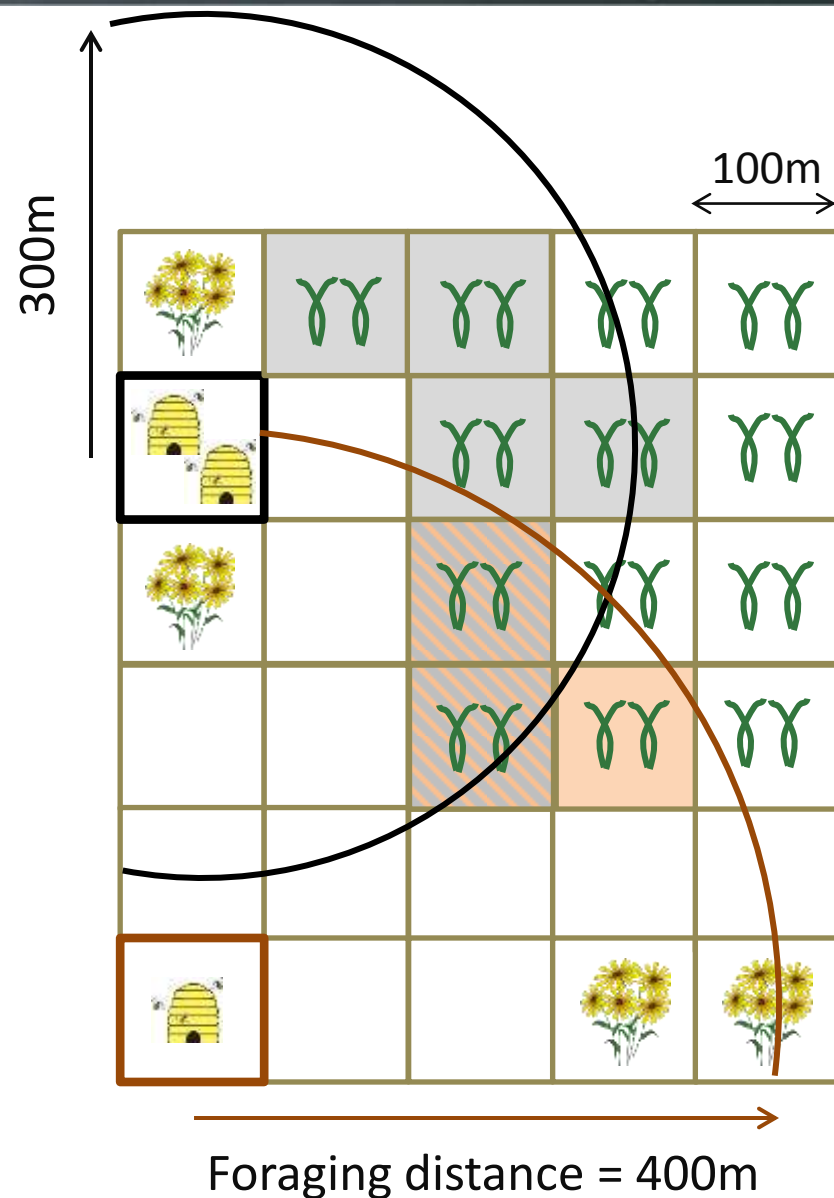
Crop response



+ Population dynamics
of pollinators / plants

Approach to Abundance

1. Calculate the abundance of bees in each cell of the landscape
 - Nesting sites in that cell
 - Floral resources in surrounding cells
2. Calculate the abundance of bees visiting each farm cell
 - Pollinator supply in surrounding cells
 - Foraging distance

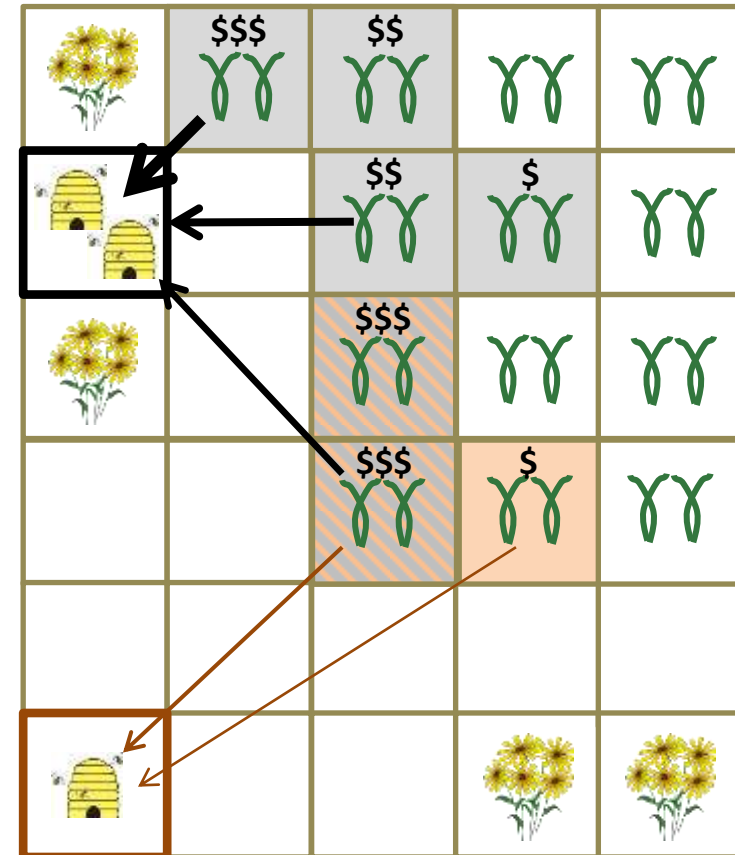


Approach to Valuation

Assumption: Crop yields increase as pollinator visitation increases, with diminishing returns

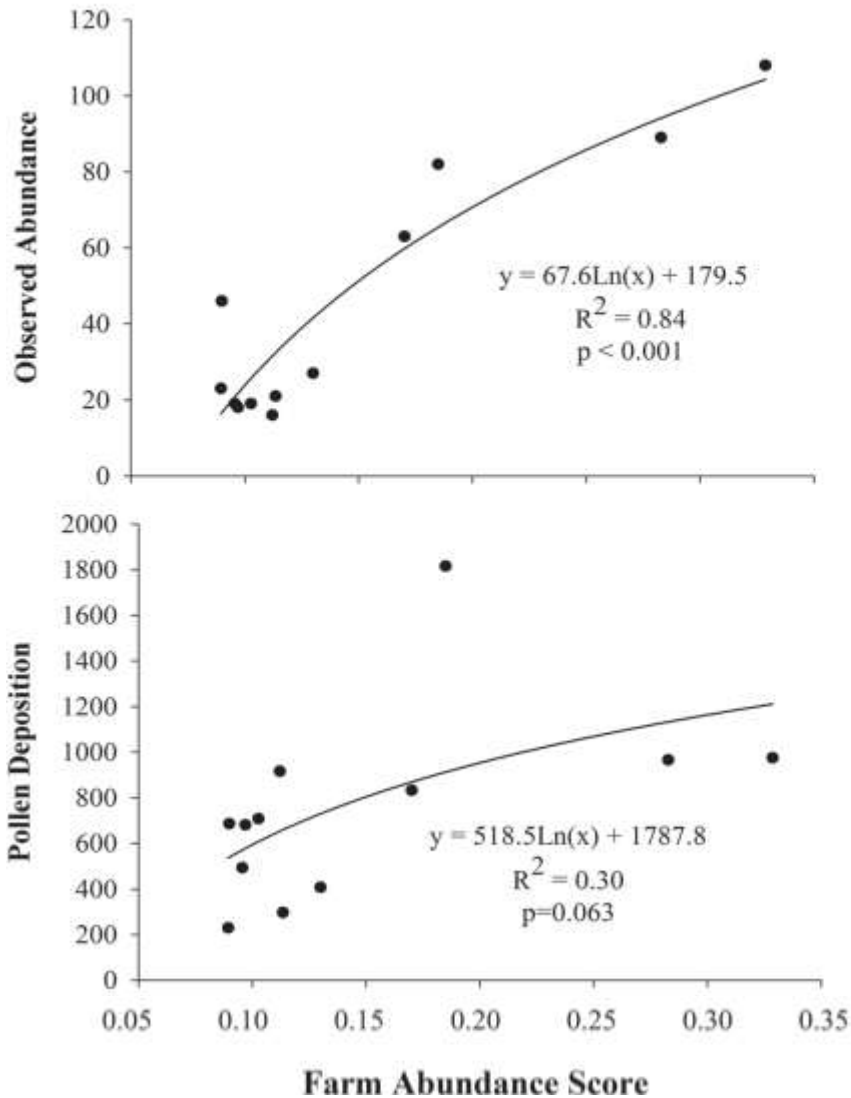
1. Calculate crop yield (value)
 - Farm abundance
 - Half-saturation constant
 - Wild pollinator proportion
2. Distribute value back to supply cells
 - Fraction for each bee species
 - Distribute fraction among source cells

Relative index, not dollar value

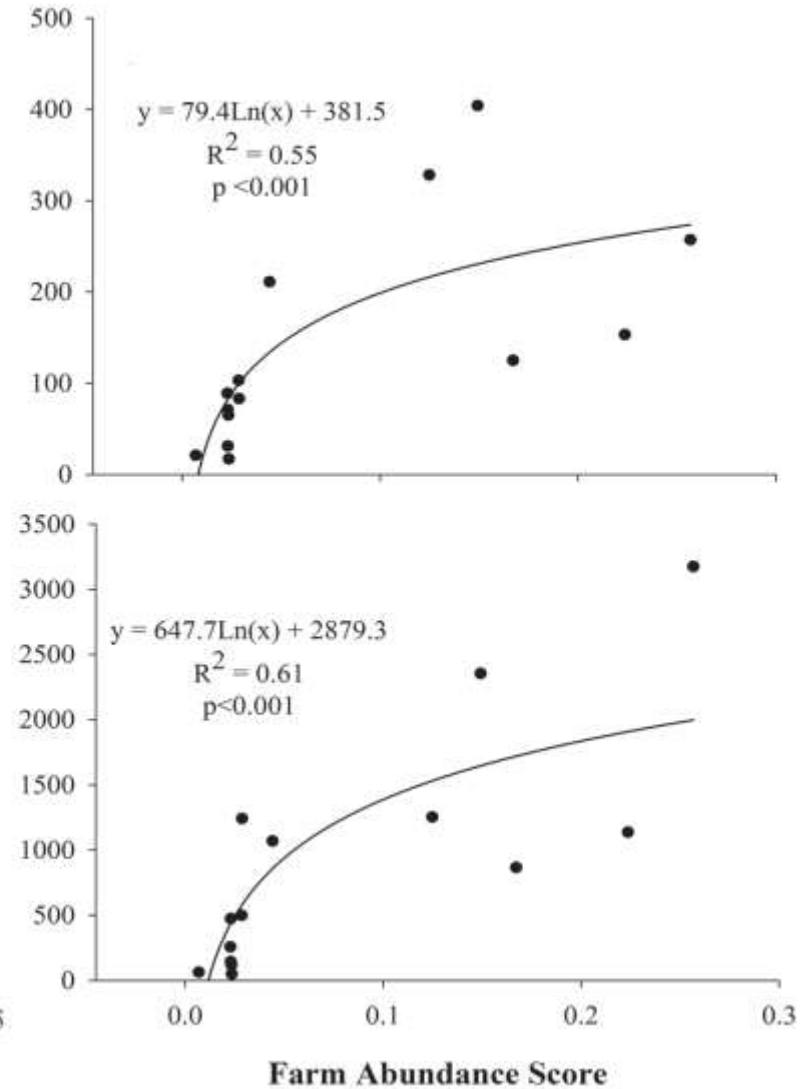


Validation

Costa Rica



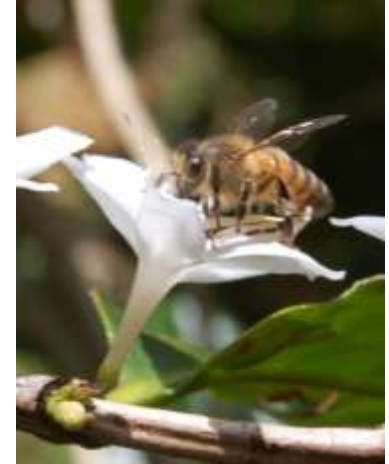
California



Sensitivity

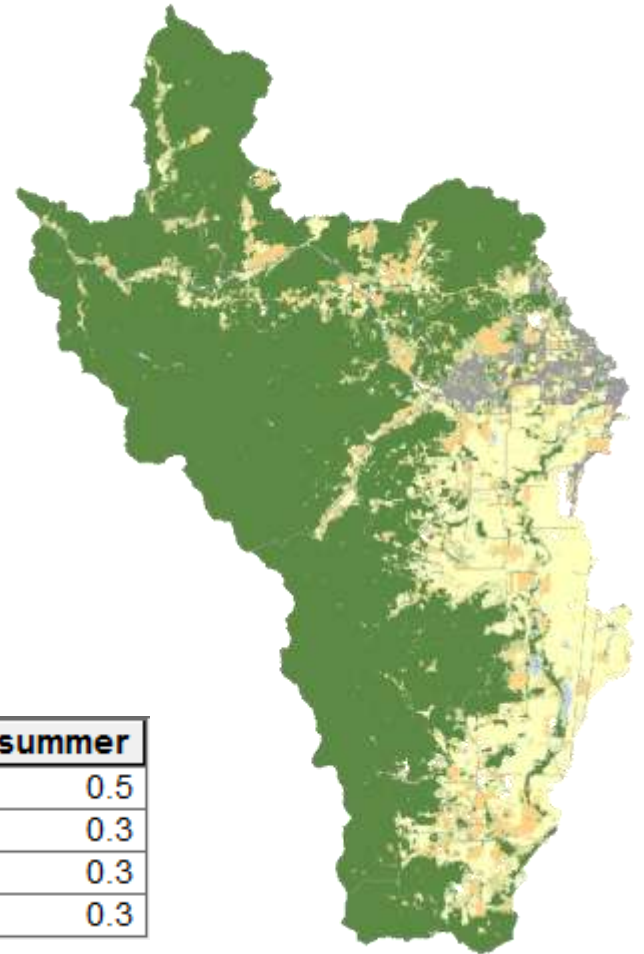
For Costa Rica study:

- Most sensitive to foraging resources in
 - coffee (t-value = 11.643, $p < .05$)
 - and forest (t-value = 3.493, $p < .05$)
- Also species foraging distance 77 – 214m
 - Huge black bee (t-value 2.376, $p < .05$)
 - *Trigona fulviventris* (t-value 3.158, $p < .05$)



Input Data

- Land use / land cover map
- Land use attributes



LandUse	N_cavity	N_ground	F_spring	F_summer
Residential	0.3	0.2	0.7	0.5
Forest Closed mixed	0.6	0.3	0.3	0.3
Field crop	0.1	0.7	0.5	0.3
Pasture	0.1	0.7	0.5	0.3

Input Data

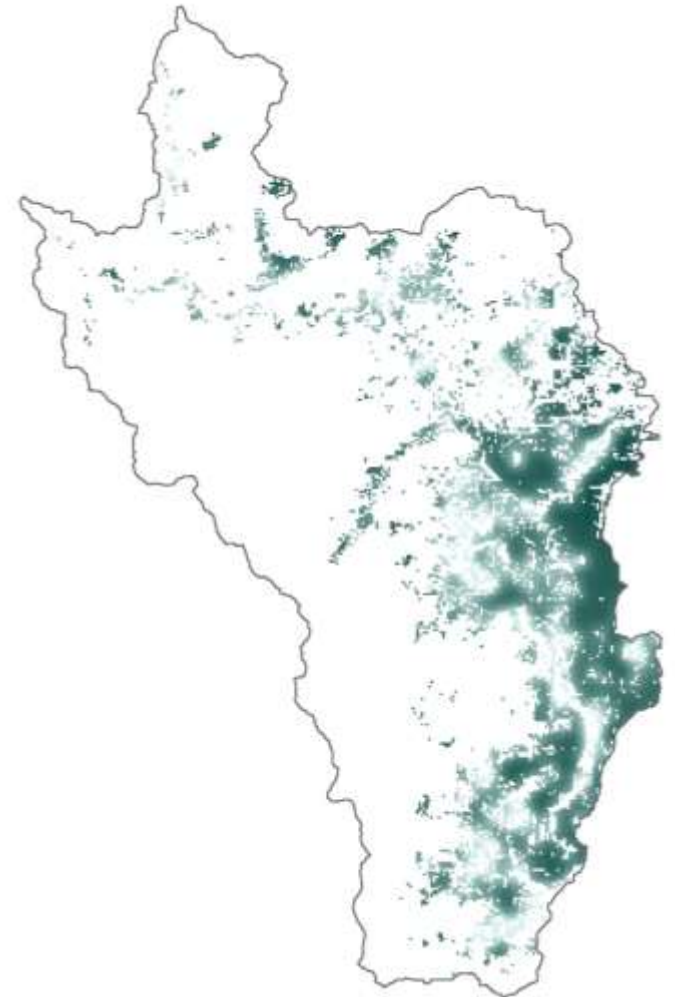
- Species / guild attributes

species	NS_cavity	NS_ground	FS_spring	FS_summer	Alpha
Apis	1	1	0.5	0.5	500
Bombus	1	0	0.4	0.6	1500

- Half-saturation constant
- Wild pollinator proportion
- Future landcover map (optional)

Output Maps

- Pollinator abundance over whole landscape
- Pollinator abundance on farms
- Pollinator service value
- For both current and future scenario, if provided



Application

- Land use planners:
Consequences of policies on farmers
- Farmers: Locate crops
- Land trust: Invest in places that benefit both biodiversity and farmers
- Payments for ecosystem services





Install GDAL

1/ Download GDAL from:

<http://www.naturalcapitalproject.org/>

2/ Open User Guide:

<InVEST install>/InVEST_2.2.1_Documentation.pdf

Post-analysis

- Colony Collapse!!



Bombus



Apis

- Prioritize conservation efforts
- Input to crop production function
- Effects of field buffers

Limitations

- Relative indices of abundance and value only
- No population dynamics over time
- Fine-scale resources not captured
- No effects of land parcel size
- No managed pollinators



Outlook

- Specify half-saturation and wild pollinator constants per land use



Equations

Pollinator abundance
on cell x :

$$P_x = N_j \frac{\sum_{m=1}^M F_j e^{\frac{-D_{mx}}{\alpha}}}{\sum_{m=1}^M e^{\frac{-D_{mx}}{\alpha}}}$$

- N_j = suitability of nesting on LULC j
- F_j = floral resources on LULC j
- D_{mx} = Euclidian distance
- α = foraging distance

Equations

Farm abundance from source cell x to ag cell o :

$$P_{ox} = \frac{P_x e^{\frac{-D_{ox}}{\alpha}}}{\sum_{x=1}^M e^{\frac{-D_{ox}}{\alpha}}}$$

- P_x = supply of pollinators on cell x
- D_{ox} = Euclidian distance
- α = foraging distance

Equations - Valuation

Expected yield of crop c on farm o :

$$Y_o = 1 - v_c + v_c \frac{P_o}{P_o + \kappa_c}$$

- v_c = proportion of crop c 's yield attributed to wild pollination
- κ_c = Half-saturation constant

Pollinator service value for cell m :

$$PS_m = v_c \sum_{o=1}^O V_o \frac{P_{om}}{P_o}$$

- V_o = crop value in farm cell o