

INTRO TO InVEST MODELS

TNC Eastern Division Training

April 29 – 30, 2014

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FWAT MODELS

CURRENT SUITE OF TOOLS



ANNUAL WATER
YIELD
HYDROPOWER



NUTRIENT
WATER
PURIFICATION



SEDIMENT
WATER
PURIFICATION



CARBON STORAGE
CLIMATE
REGULATION



HABITAT QUALITY
BIODIVERSITY



HABITAT RISK
ASSESSMENT



TIMBER
PRODUCTION



POLLINATOR
ABUNDANCE
CROP POLLINATION

FWAT MODELS IN DEVELOPMENT



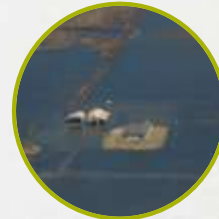
SEASONAL
WATER YIELD
HYDROPOWER,
IRRIGATION



NUTRIENT
WATER
PURIFICATION



SEDIMENT
WATER
PURIFICATION



FLOOD
MITIGATION



AGRICULTURE

RESOURCES

QUESTIONS? ISSUES WITH THE MODELS?

- InVEST **User's guide**: [www.naturalcapitalproject.org/ models/ models.html](http://www.naturalcapitalproject.org/models/models.html)
(latest version online, pdf version of the current release with download)
- InVEST **forums**: <http://ncp-yamato.stanford.edu/natcapforums/>
- **Literature**: how other people used the models!

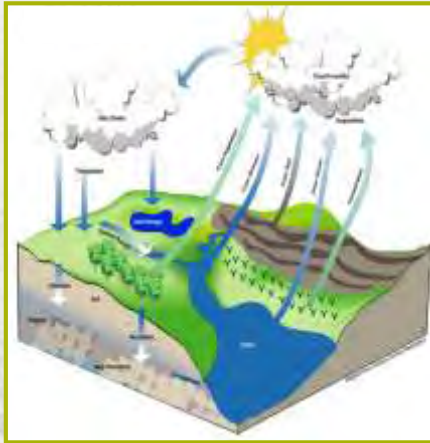
InVEST

integrated valuation of
environmental services
and tradeoffs

ANNUAL WATER YIELD



MODEL OVERVIEW



**Supply: Water
yield**



Hydropower



Drinking water

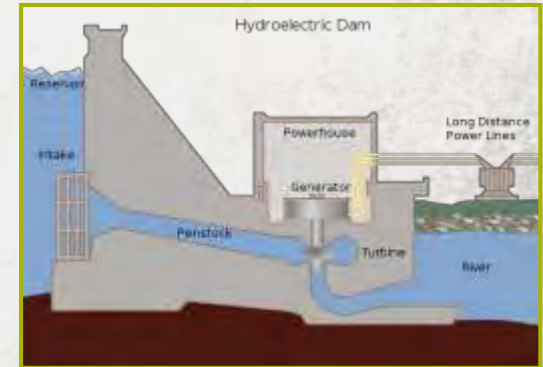


Irrigation



**Pollution
dilution**

**Service: Water
scarcity**



**Value: Hydropower
production....**

AIMS

QUESTIONS THE MODEL HELPS ANSWER

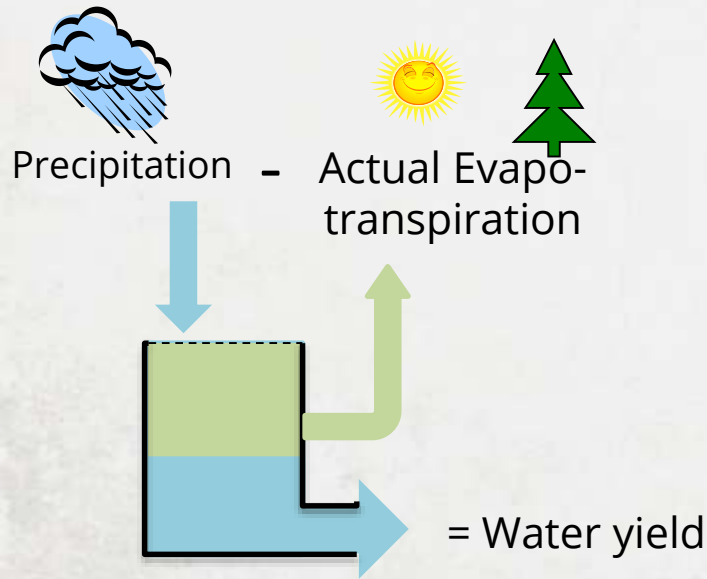
- How much water is available in my catchment?
- Where does the water used for hydropower production come from?
- How much energy does it produce?
- How much is it worth?

SUPPLY

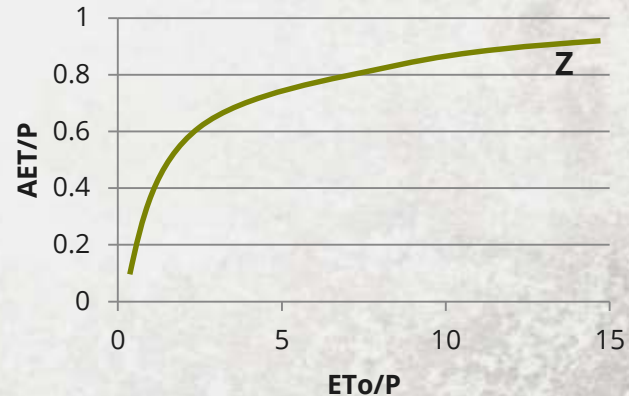
Annual water yield

SUPPLY: ANNUAL WATER YIELD

BASIC PRINCIPLES

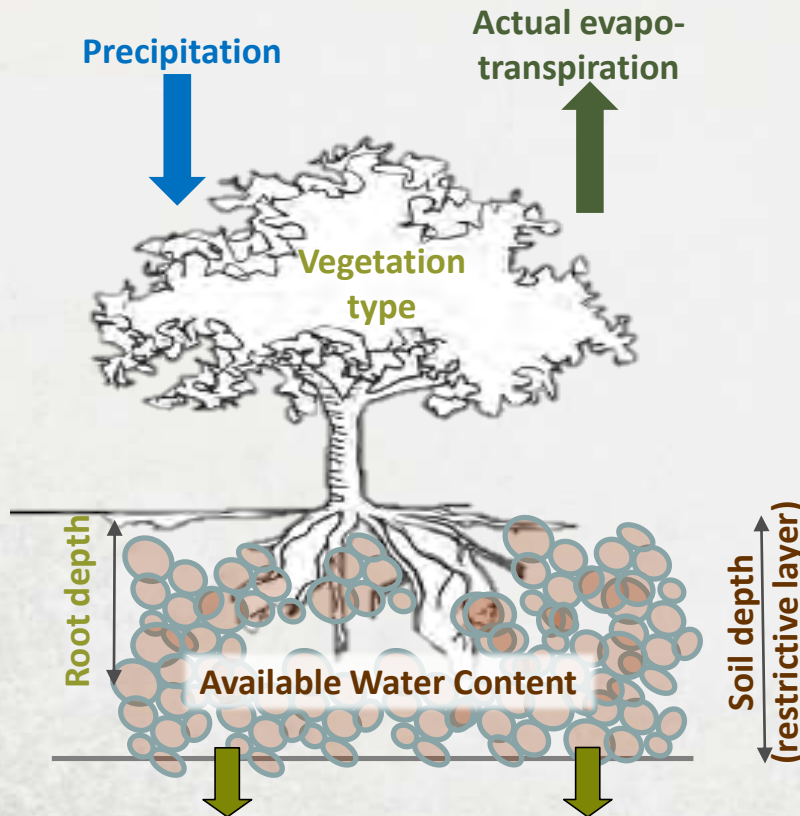


- Precipitation: rain only
- Evapotranspiration: energy demand (wind/sun)
- Budyko curve theory: water/energy budget



SUPPLY: ANNUAL WATER YIELD

BASIC PRINCIPLES



- On EACH CELL:

Potential evapotranspiration:
“energy demand”

Actual evapotranspiration:
water actually evapotranspired!

- **TOTAL YIELD:**

SUM OF CELLS

SUPPLY: ANNUAL WATER YIELD

WHAT HAPPENS WITH NON-VEGETATED LULC?

Theory developed for natural vegetation (forests, grassland)

- Urban land use?
- Open water?
- Wetlands?

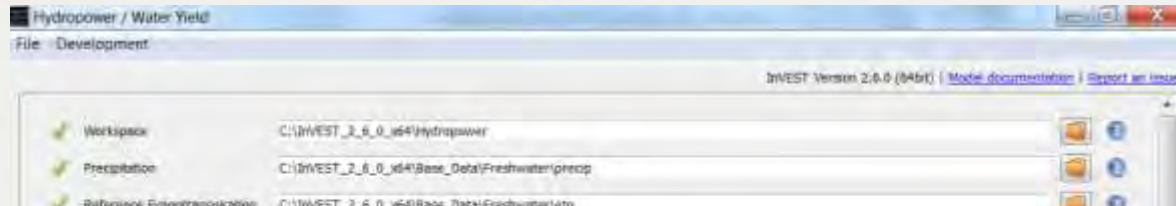
Possibility to use a **different equation**:

$$AET = K_c \times ET_0$$

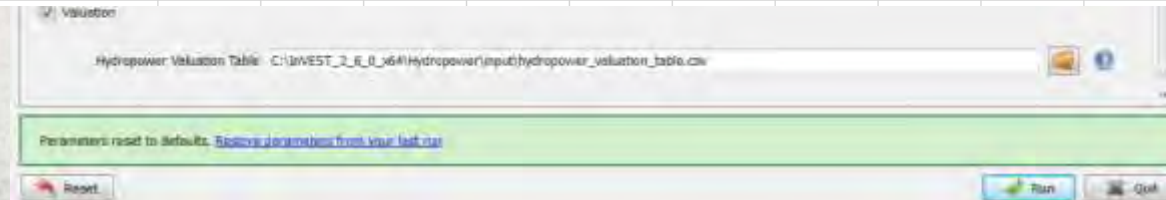
Actual evapotranspiration

Reference evapotranspiration

ANNUAL WATER YIELD



	1	2	3	4	5	6	7	8	9	10	11	12
1	LULC_desc	lucode	Kc	root_dept	usle_c	usle_p	sedret_eff	load_n	eff_n	load_p	eff_p	LULC_veg
2	Residential? 0-4 DU/ac	1	0.5	700	10	1	5	7000	5	1000	5	0
3	Residential 4-9 DU/ac?	2	0.2	500	10	1	10	7250	5	1100	5	0
4	Residential? 9-16 DU/a	3	0.3	500	1	1	5	7500	5	1200	5	0
5	Residential? >16 DU/ac	4	0.1	300	1	1	5	7750	5	1300	5	0
6	Vacant	5	0.3	10	10	350	5	50	5	1	5	0
7	Commercial	6	0.3	500	1	1	5	13800	5	3000	5	0
8	Comm/Industrial	7	0.3	500	1	1	5	8000	5	3400	5	0
9	Industrial	8	0.3	500	1	1	5	1000	5	3800	5	0
10	Industrial & Comm.	9	0.3	500	1	1	5	8000	5	3400	5	0
11	Residential & Comm.	10	0.3	500	1	1	5	9000	5	2500	5	0
12	Urban non-vegetated u	11	0.1	10	1	1	5	4000	5	500	5	0
13	Rural structures	16	0.3	500	1	1	5	10000	10	5	10	0
14	Railroad	18	0.1	50	1	1	5	10	5	5	5	0



SERVICE AND VALUE

Water scarcity and Hydropower production

SERVICE WATER SCARCITY

Simple water balance:

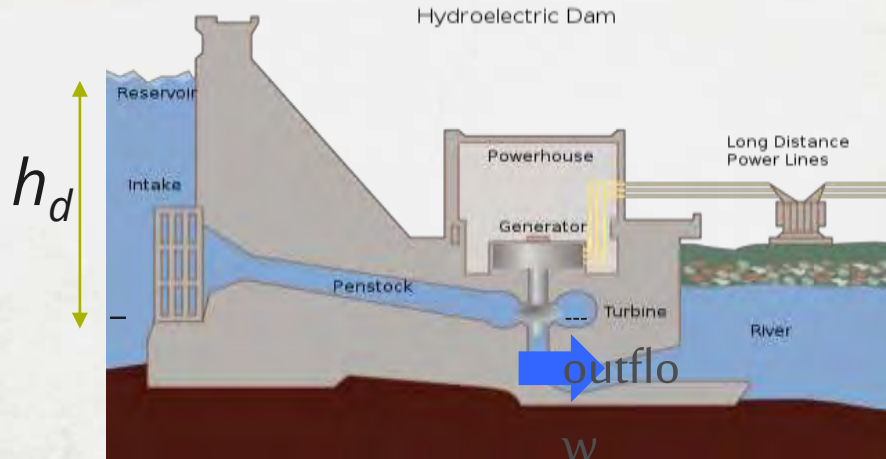
$$V_{in} = WY - d$$

Volume in reservoir **Water yield** **Demand:** upstream the point of interest (reservoir)



VALUE

HYDROPOWER PRODUCTION



Energy $\varepsilon_d = 0.00272 \times \overset{\text{head}}{h_d} \times \overset{\text{efficiency}}{\beta} \times \overset{\%}{\gamma} \times \overset{\text{Annual volume}}{V_{in}}$

SUMMARY

Inputs, outputs, assumptions

ANNUAL WATER YIELD

MODEL INPUTS



Climate

Precipitation; Reference evapotranspiration; Z coefficient



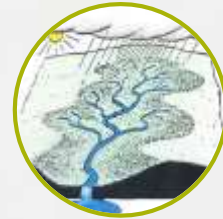
Soils

Soil depth; Available Water content



Land Use/ Land Cover (LULC)

Raster; Root depth; Crop coefficient



Watersheds

Upstream of point of interest (e.g. reservoir)



Water demand

Irrigation, drinking water



Hydropower valuation

Plant data, economic data

ANNUAL WATER YIELD

MODEL OUTPUTS

- Water yield (mm and m³)
- Actual evapotranspiration (mm)
- Water supply (mm and m³)
- Energy/value for hydropower

Actual evapotranspiration



Water yield



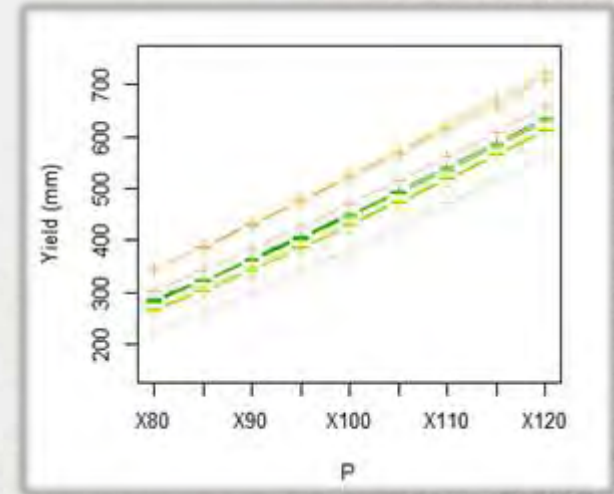
MAIN ASSUMPTIONS

SUPPLY

- **Long term** annual water balance
- No distinction between **surface** and **subsurface** flow
- Use **local data** (sensitivity to climate inputs)

SERVICE AND VALUATION

- **Source of water demand** is in the catchment
- No account of **seasonality**
- Simple relationship between yield and power



IMPROVING MODEL INTERPRETATION

- Critical **selection of model inputs**: check sources, literature, etc.
- Enhanced possibilities for **uncertainty analyses** (batch runs)
 - Confidence intervals
 - Calibration
- Possibility to “**customize**” the model (use of alternative equation)
- Improved guidance on **Z coefficient** (proportional to number of events)

Q & A

NUTRIENT RETENTION



NUTRIENT POLLUTION

- ~ **14,000** people die daily from water pollution
- Global water treatment cost: ~**\$24.6 billion/year**
- Dead zone in the Gulf of Mexico: ~**17,000 km²**
- Non-point sources are a major cause



NASA, 2008

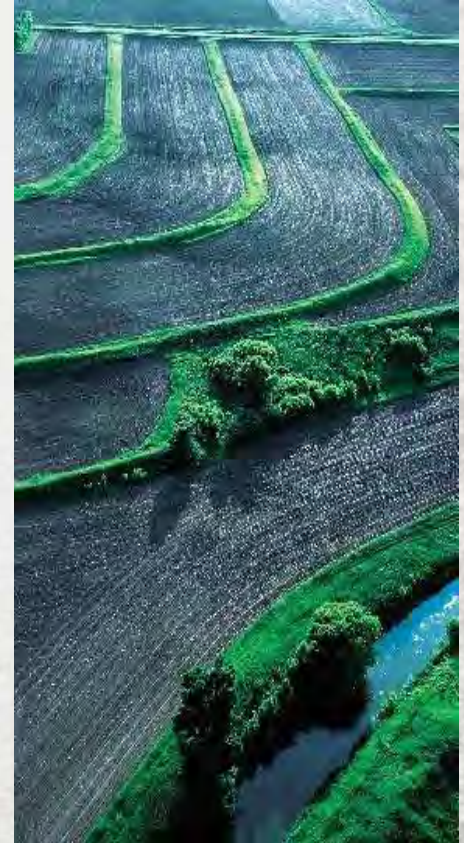
NUTRIENT MODEL QUESTIONS

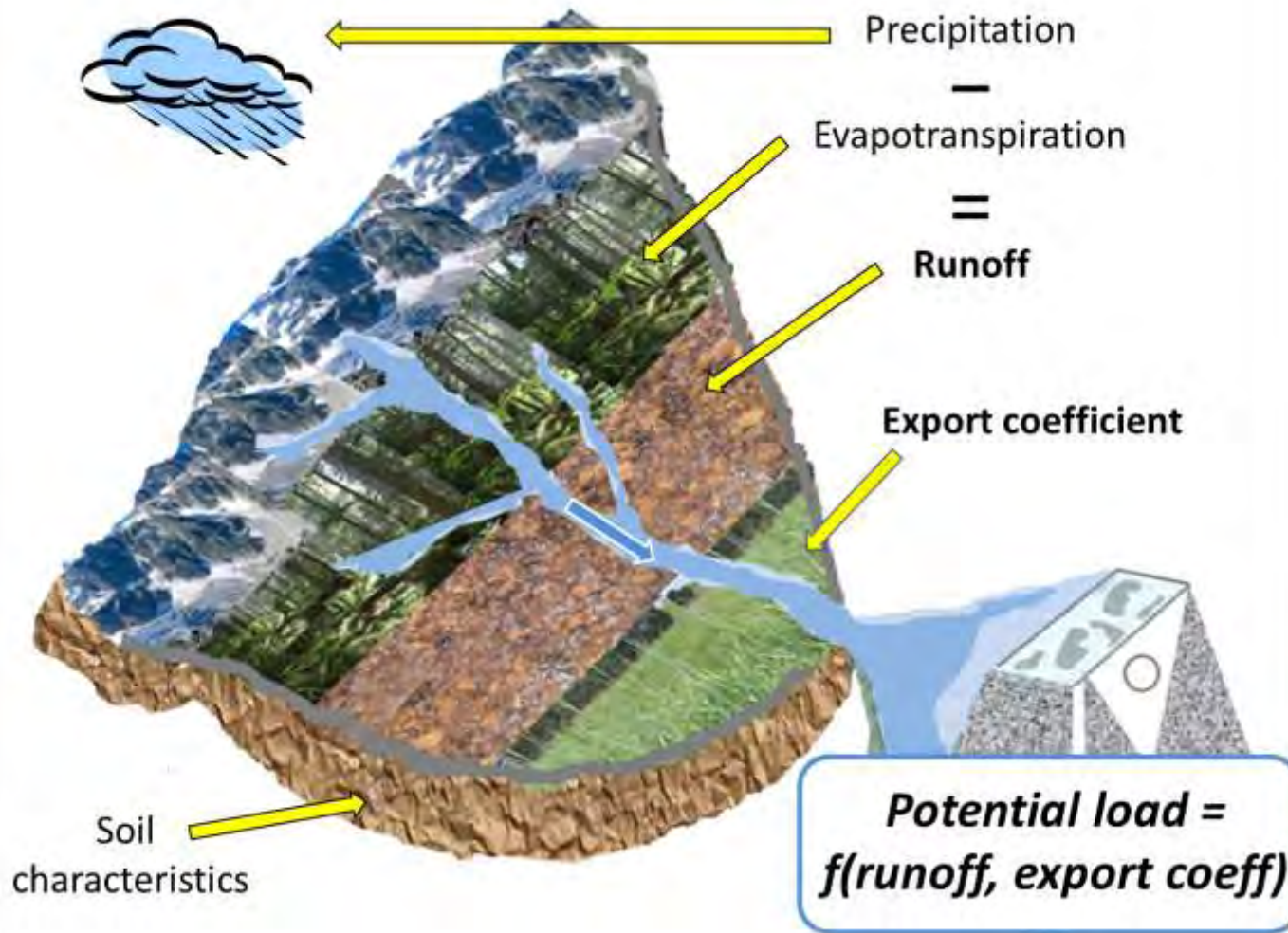
- Where are the pollutant sources?
- Where is natural capital providing nutrient retention on the landscape?
- How much is retained?
- What is the value of this retention for avoided costs of treatment?



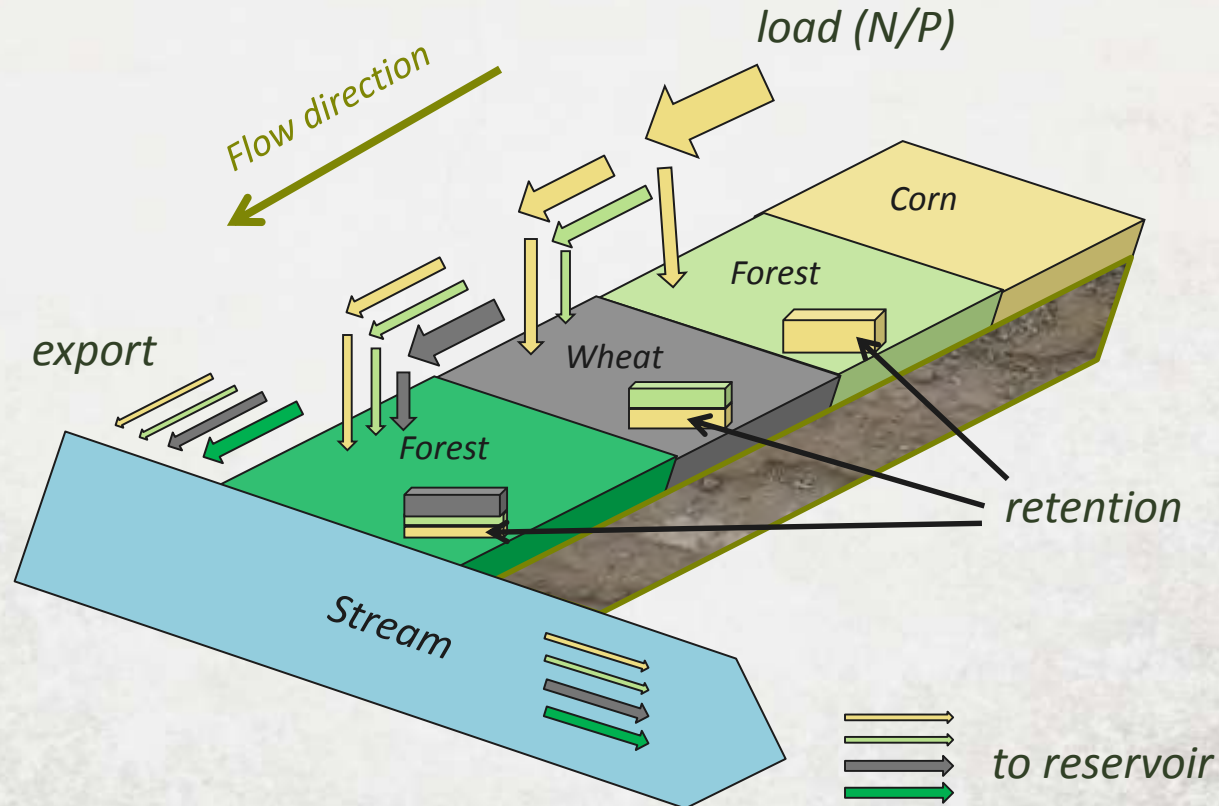
NUTRIENT RETENTION MODEL

- Based on runoff and export coefficients
 - Includes geomorphology and climate
 - Potential export from a parcel
 - Nitrogen and phosphorus
- Enhanced by hydrologic connectivity
 - What happens as the parcel's export moves downslope?
 - Influence of intervening landcover
- Nutrient retention valued as ecosystem service



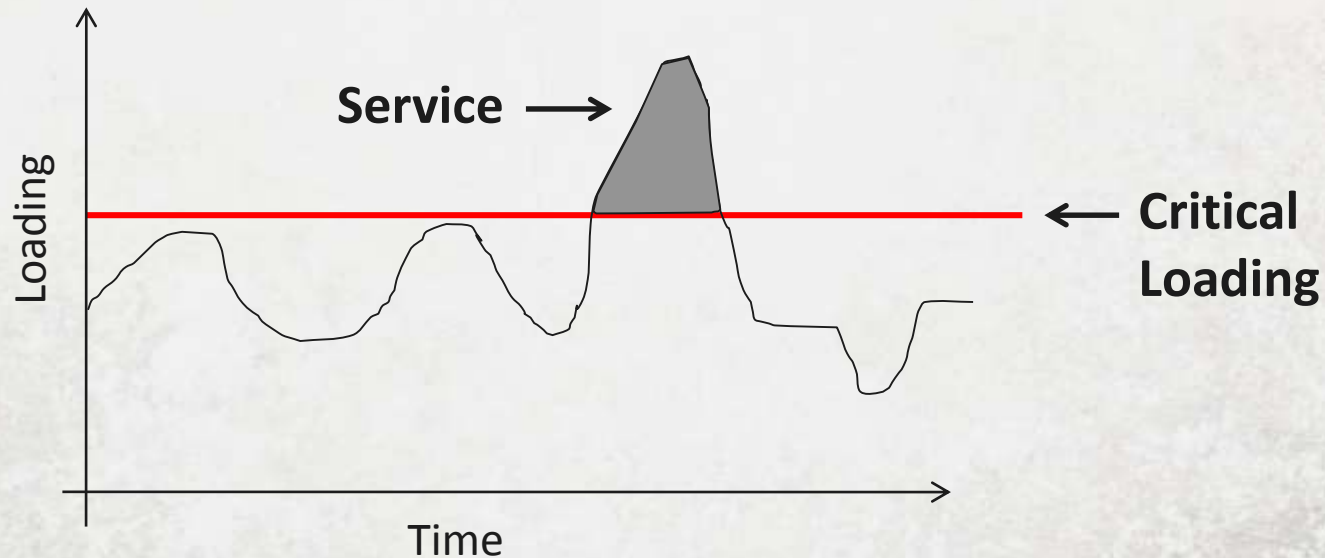


MODEL OVERVIEW



VALUATION MODEL

Based on *avoided treatment costs*



MODEL INPUTS



Climate

Precipitation, Potential evapotranspiration, Zhang



Soils

Soil depth,
Available water content



Topography

Digital elevation model



Watersheds

Catchments flowing into
points of interest



Land use/Land cover

Export coefficients, retention capacity, root depth, etc



Economic

Critical loading, treatment cost, time, discount rate

MODEL COEFFICIENTS

	1	2	3	4	5	6	7	8	9	10	11	12
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MODEL OUTPUTS



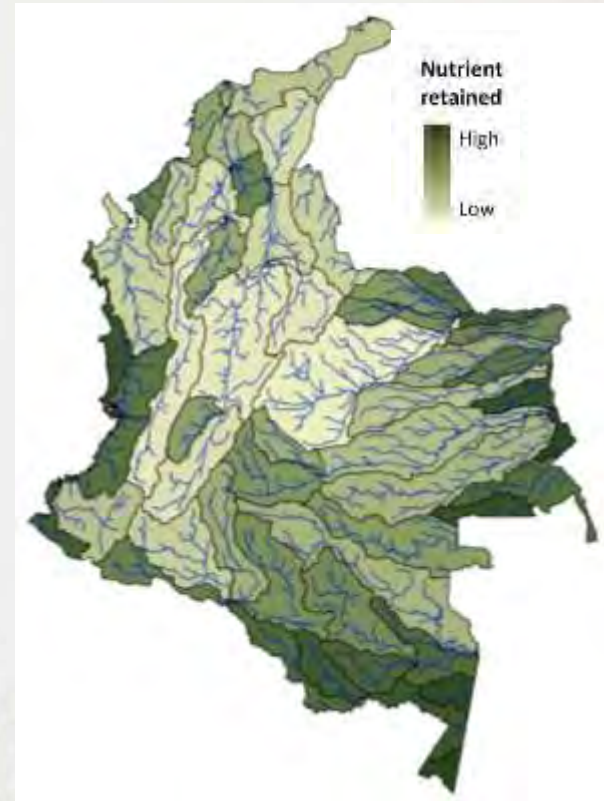
Nutrient Exported
Kg/year



Nutrient Retained
Kg/year
Used in valuation



Value of Nutrient Removal
for Water Quality
Currency over time period



BIOPHYSICAL RESULTS

Land cover



- agriculture
- forest
- mining/degraded
- natural vegetation
- pasture
- urban
- water

Mean Nitrogen
Retention



Mean Nitrogen
Export



+ Total export to reservoir

MODEL LIMITATIONS

- All bio-physio-chemical processes are lumped in one export coefficient
- Annual basis, no seasonality
- No in-stream processes or point sources
- Assess one pollutant per run
- No saturation in uptake



Q & A

SEDIMENT RETENTION



AIMS

QUESTIONS THE MODEL HELPS ANSWER

- Where are the sediment sources?
- Where is sediment retained?
- How much is retained?
- What is the value of this retention?

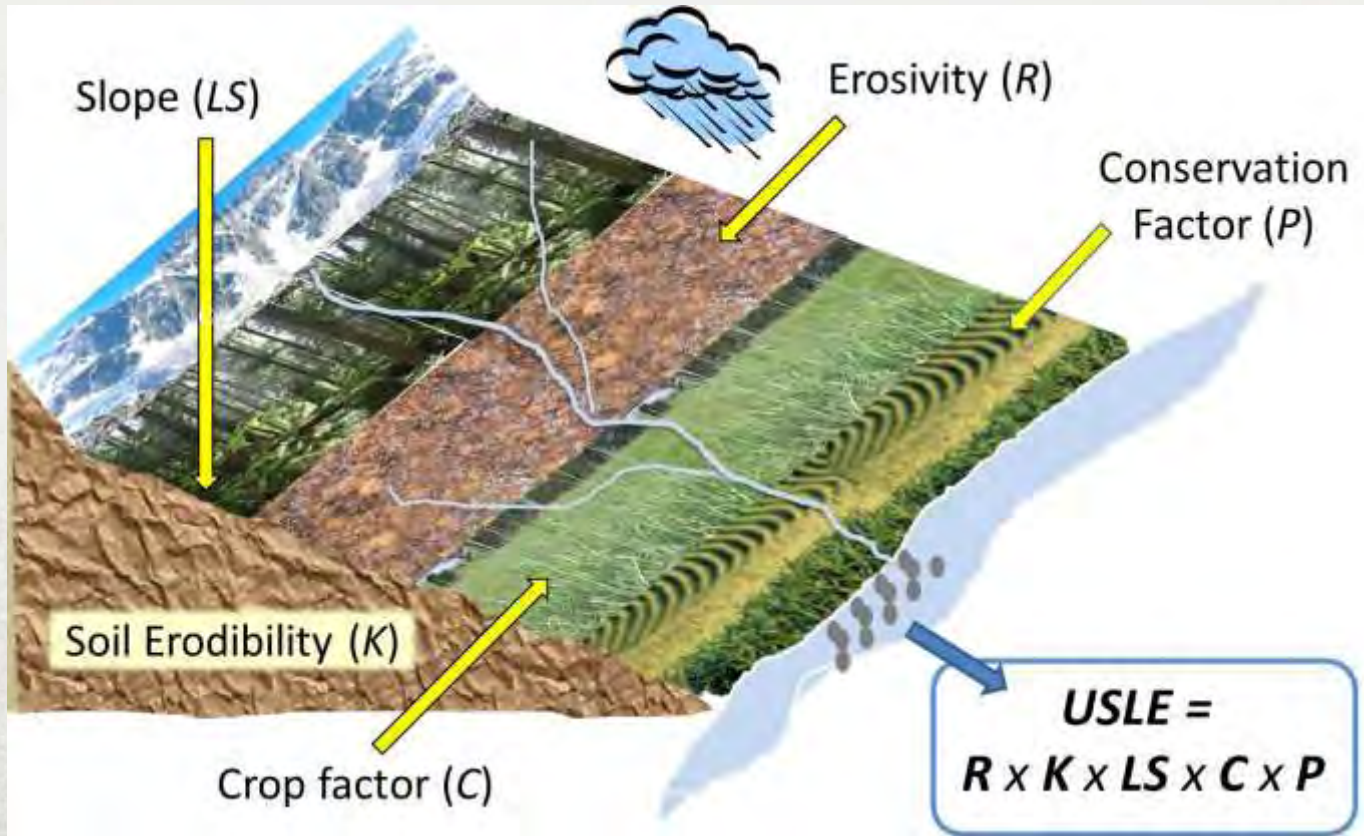


MODEL OVERVIEW

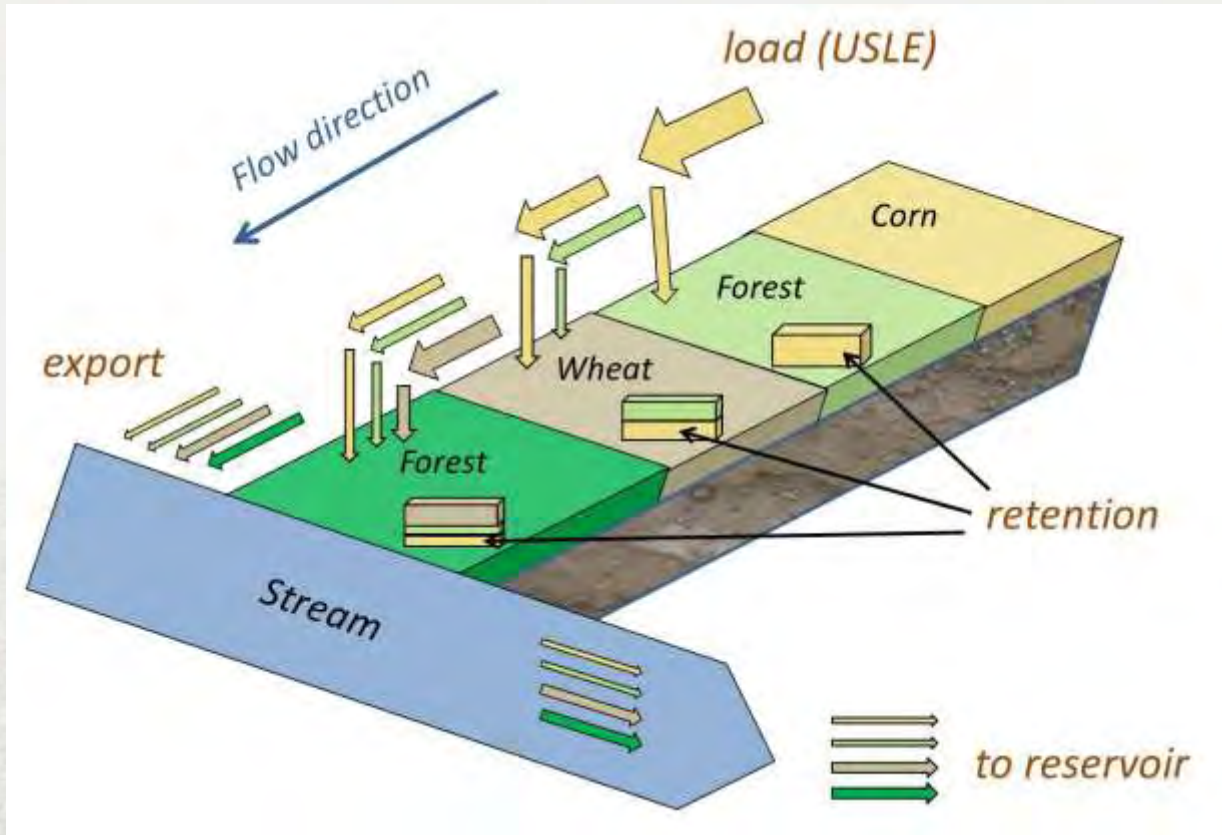
- Based on the Universal Soil Loss Equation (USLE)
 - Includes geomorphology and climate
 - Potential erosion on a parcel
- Enhanced by hydrologic connectivity
 - What happens as the parcel's sediment moves downslope?
 - Influence of intervening landcover
- Sediment retention valued as ecosystem service



MODEL OVERVIEW

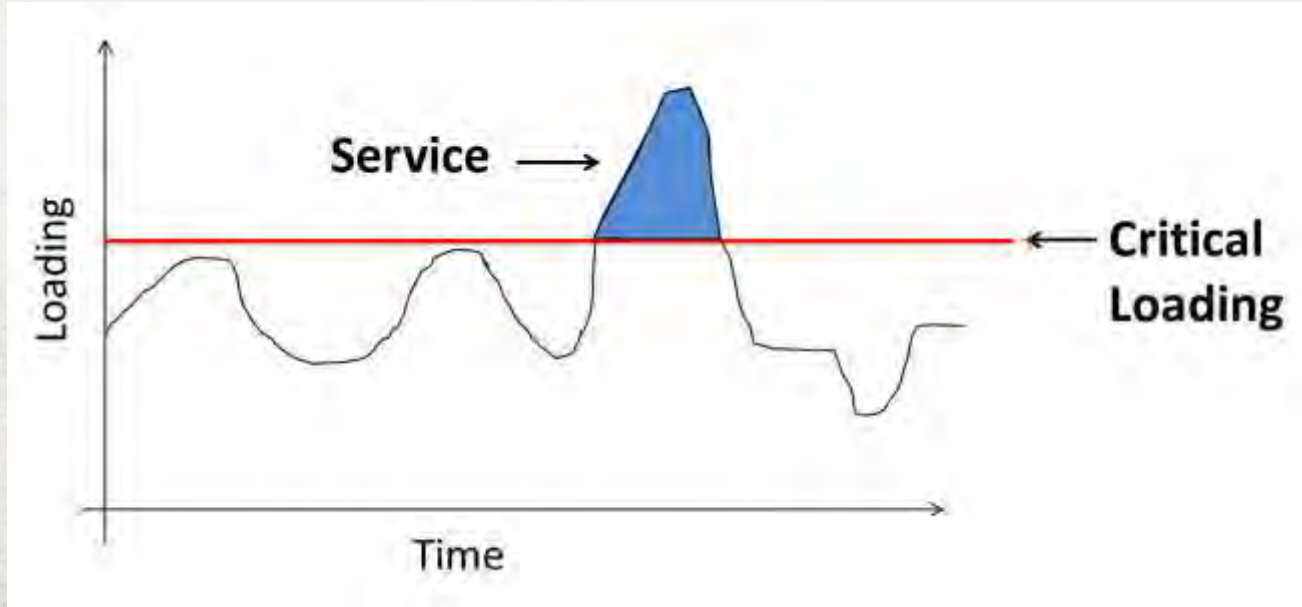


MODEL OVERVIEW



VALUATION

- Based on avoided treatment costs
- Can value for dredging and/or water quality



BIOPHYSICAL INPUTS



Land use/Land cover

Vegetation retention, land practice and management



Topography

Digital elevation model, slope threshold



Erosivity

Based on intensity and kinetic energy of rainfall



Erodibility

Soil detachment and transport potential due to rainfall



Streams

Used to determine where sediment flows to



Watershed Areas

Catchments flowing into reservoirs



Reservoir Features

Dead volume, lifetime of reservoir, allowed load

BIOPHYSICAL OUTPUTS



Potential Soil loss

Calculated from USLE
Per sub-watershed



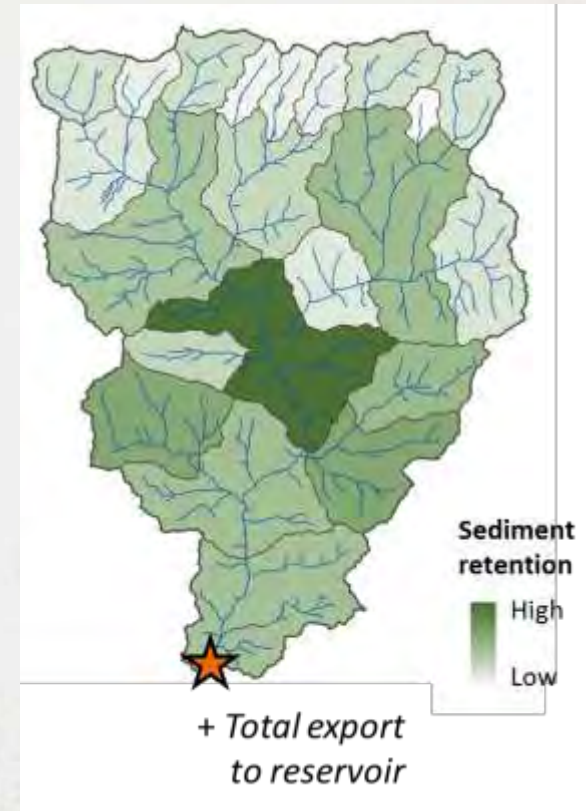
Sediment Retained

Per watershed and
sub-watershed
Used in valuation



Sediment Exported

Per watershed and
sub-watershed



VALUATION

Input



Sediment Retained

From biophysical analysis



Economic data

Reservoir dredging costs
Or water quality filtering costs



Watershed Areas

Catchments flowing into
reservoirs

Output

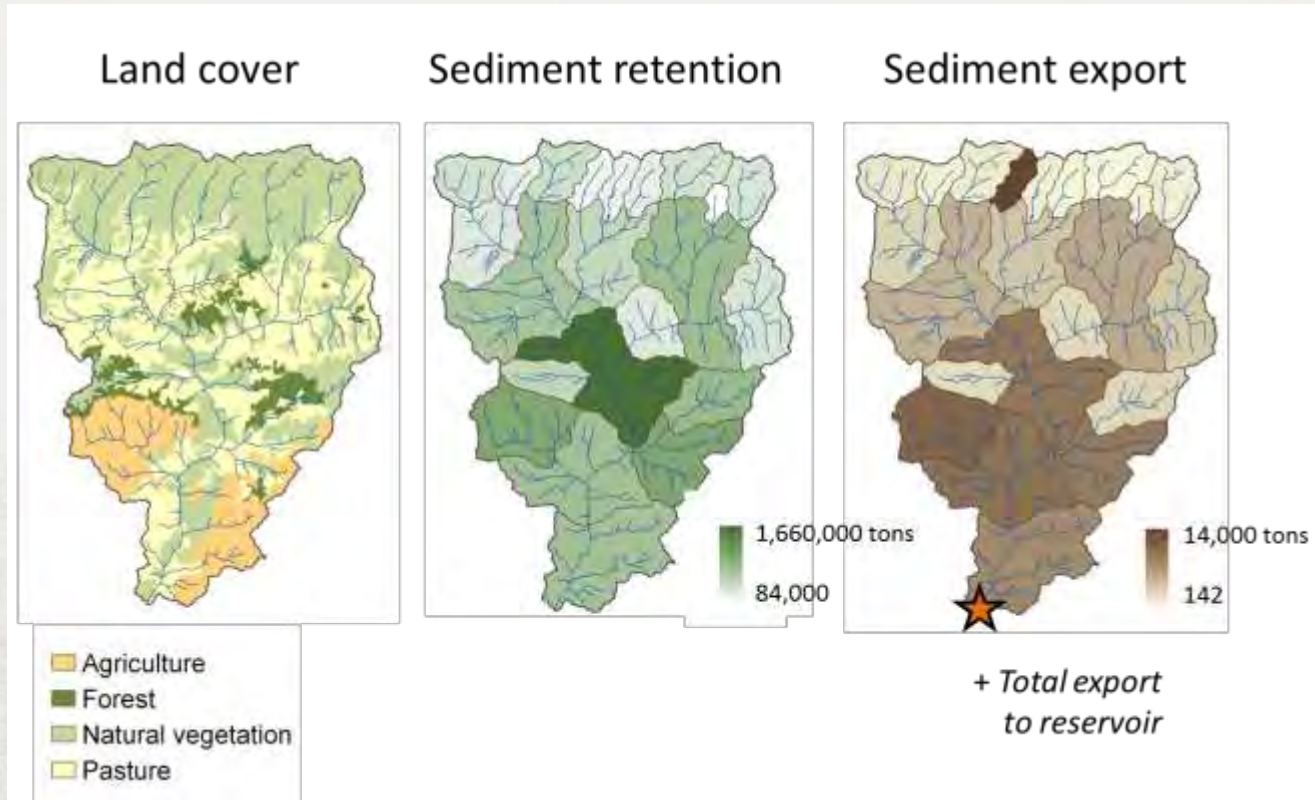


**Value of Sediment
Removal for
Dredging**



**Value of Sediment
Removal for Water
Quality**

INTERPRETING RESULTS



LIMITATIONS/ASSUMPTIONS

- Predicts erosion from sheet wash alone
- Sediment gets to outlet within a year
- No limit to retention
- Neglects the role of topography, soil, climate in the retention processes
- Accuracy limited in mountainous areas



FUTURE STEPS

- Sediment delivery ratio
- Gully and bank erosion
- Dam retention
- In-stream flow and retention



Q & A

CARBON STORAGE AND SEQUESTRATION



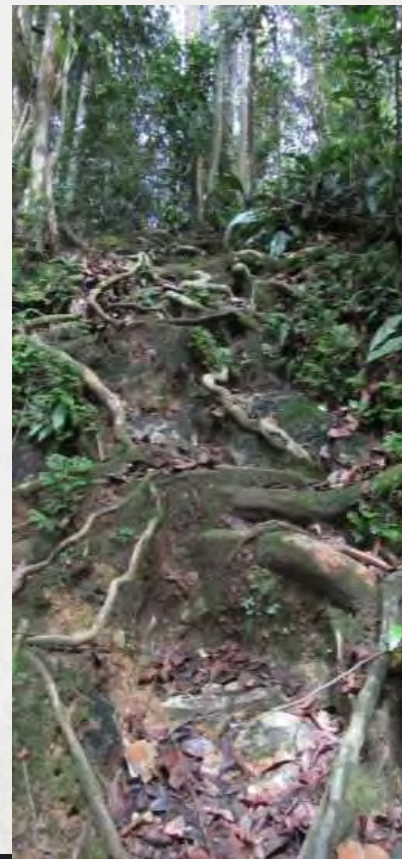
CARBON BACKGROUND

- Climate change mitigation
 - Reforestation
 - Soil management
 - Plantation practices
 - Crop practices
- Carbon markets
- Reducing deforestation and forest degradation (REDD)
- Kyoto Protocol



EXISTING MODELS

- U.S. Forest Service has several:
 - MC1 - global vegetation dynamics
 - FVS - tree growth and yield simulator
 - FORCARB2 - stock and change projections
 - Complex, often U.S.-centric
- CENTURY – plant-soil nutrient cycling
- LPJml – global managed vegetation and water balance
 - Very complex set of input parameters
 - More details than many users need

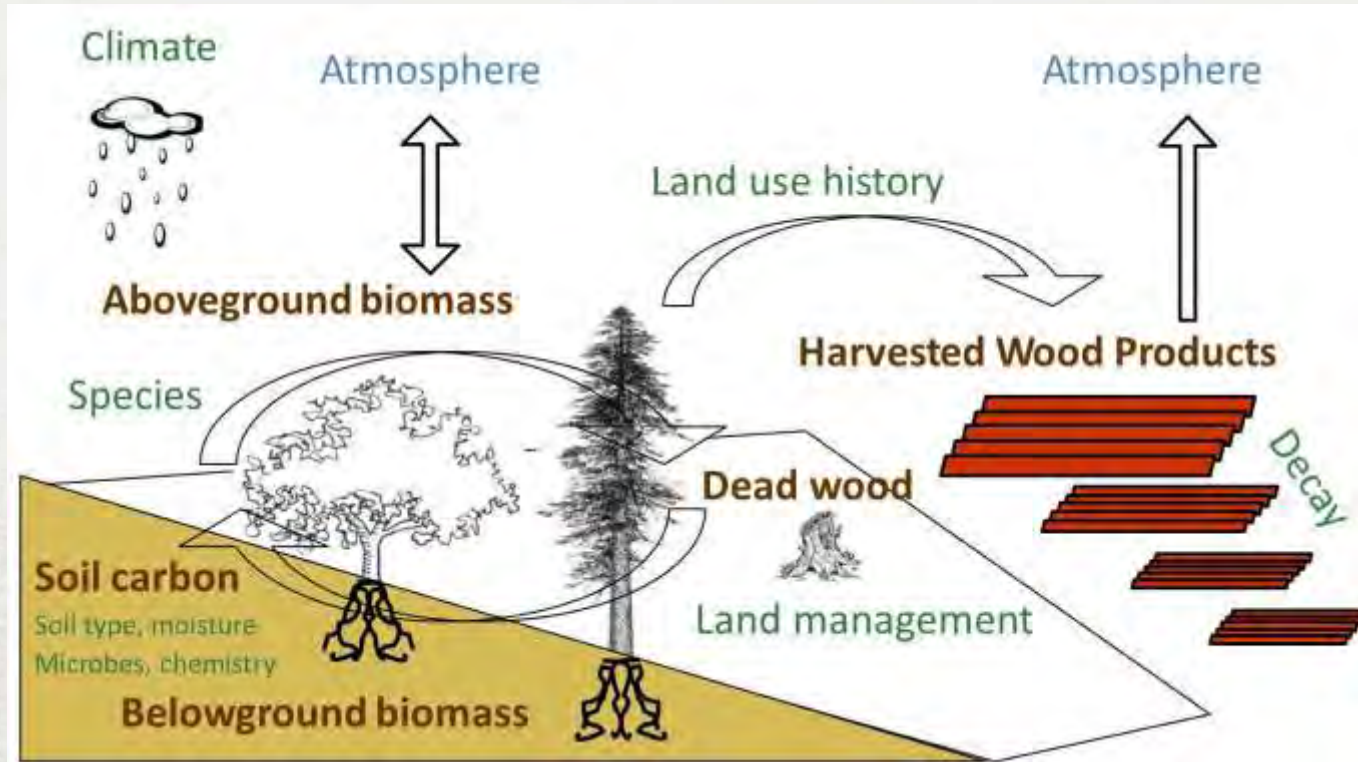


InVEST CARBON STORAGE MODEL

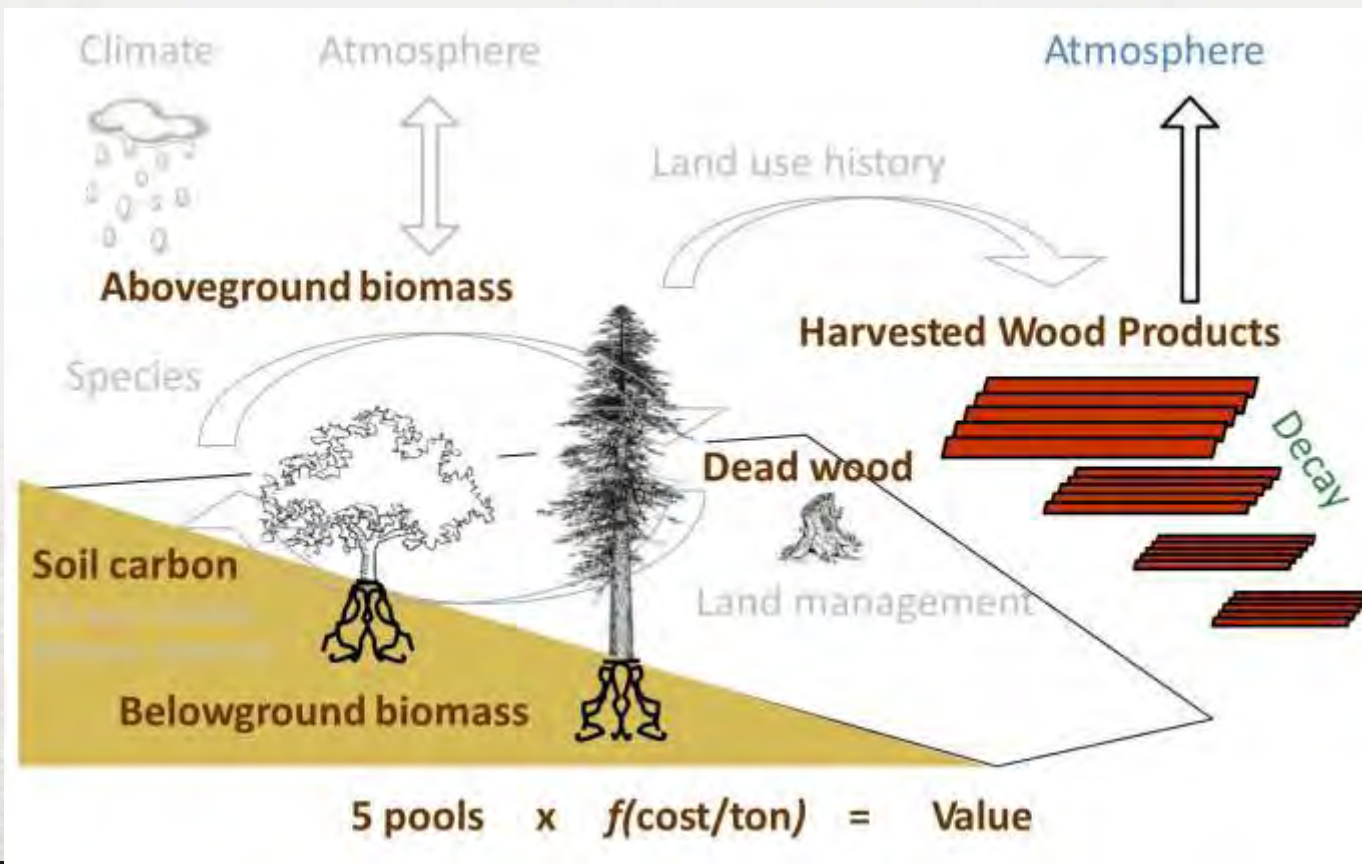
- Model estimates carbon stock as a function of land use/land cover.
- *Storage* indicates the mass of carbon in an ecosystem at any given point in time.
- *Sequestration* indicates the change in carbon storage in an ecosystem over time.
- Valuation is applied to sequestration.



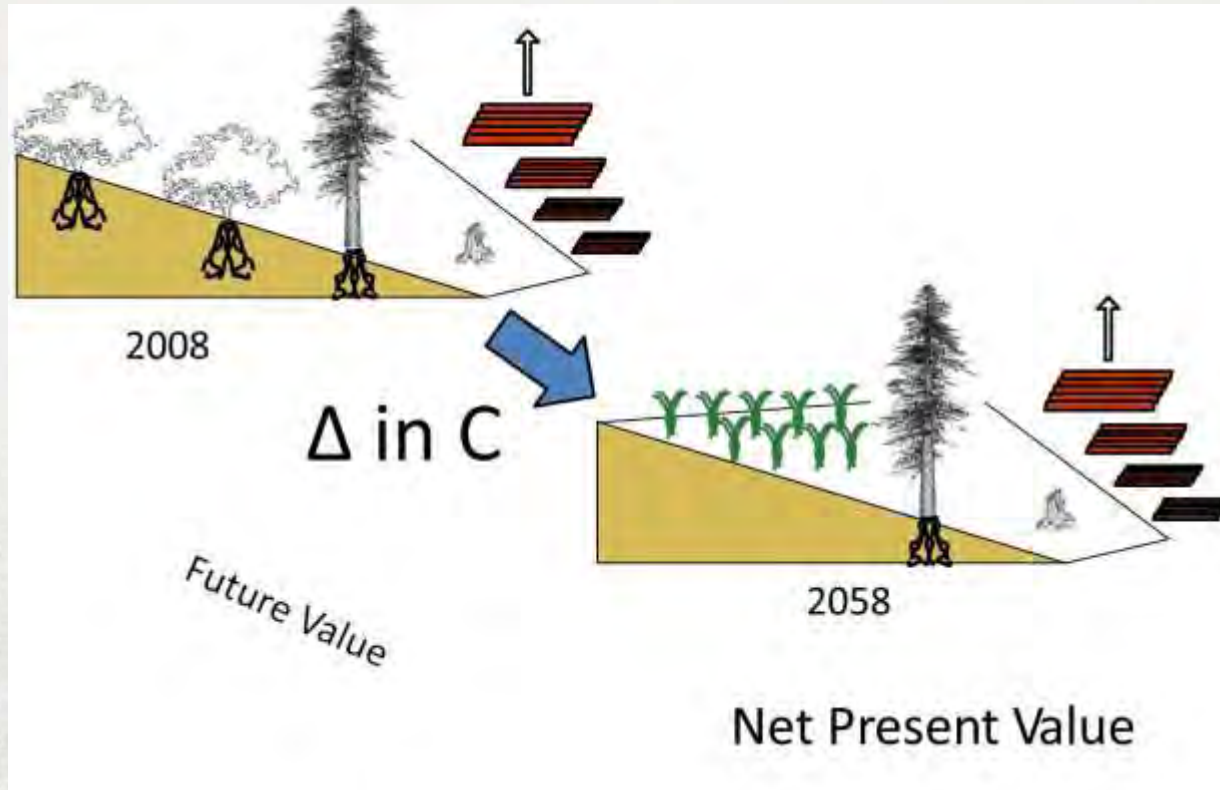
CARBON – OVERVIEW



InVEST CARBON STORAGE MODEL



SEQUESTRATION AND VALUE



APPROACH TO VALUATION

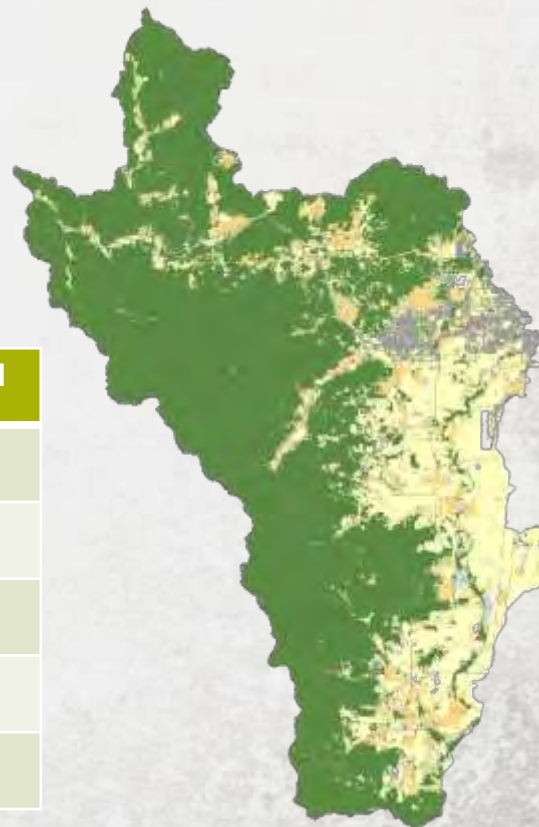
- Net Present Value is a function of:
 - Market discount rate
 - Rate of change in the social value of carbon
 - Social or market cost of carbon
- Carbon model is most appropriate for valuing **the social cost of carbon**: What is the benefit from avoiding damage from CO₂ release?



INPUT DATA

- Required data:
 - Land use/land cover (LULC map)
 - Table of carbon pools (metric tons/ha):

LULC	LULC_name	C_above	C_below	C_soil	C_dead
1	Forest	140	70	35	12
2	Coffee	65	40	25	6
3	Pasture/grass	15	35	30	4
4	Shrubs	30	30	30	13
5	Open/urban	5	5	15	2



CARBON POOL DATA

- Local plot studies
- Published analysis on similar regions
- IPCC tables

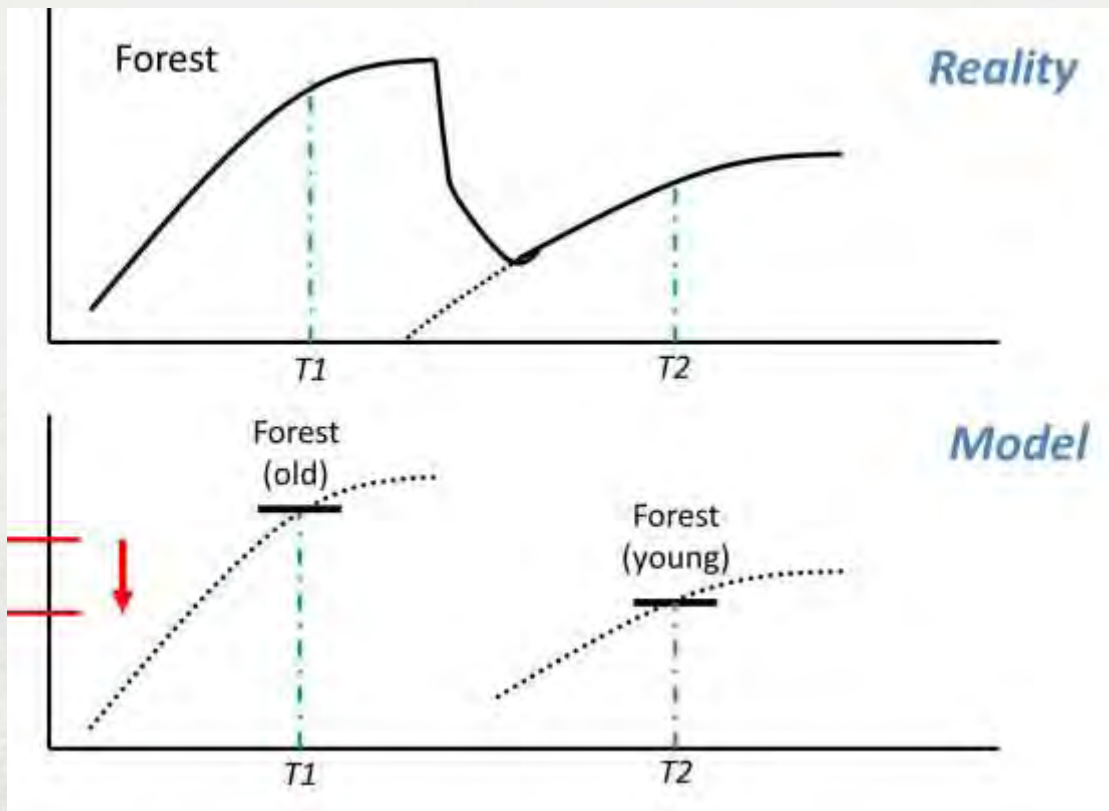
Ecological zone	Continent	Above-ground biomass (tonnes d.m. ha ⁻¹)
Tropical rain forest	Africa	310 (130-510)
	North and South America	300 (120-400)
	Asia (continental)	280 (120-680)
	Asia (insular)	350 (280-520)
Tropical dry forest	Africa	260 (160-430)
	North and South America	210 (200-410)
	Asia (continental)	130 (100-160)
	Asia (insular)	160

OPTIONAL DATA

- Future land use map
- Economic data (carbon value, discount rate)
- Timber harvest parcels
 - Frequency of harvest
 - Annual harvest amount
 - Decay rate of wood products
 - Density/volume factors
- REDD scenarios



LAND COVER TRANSITIONS



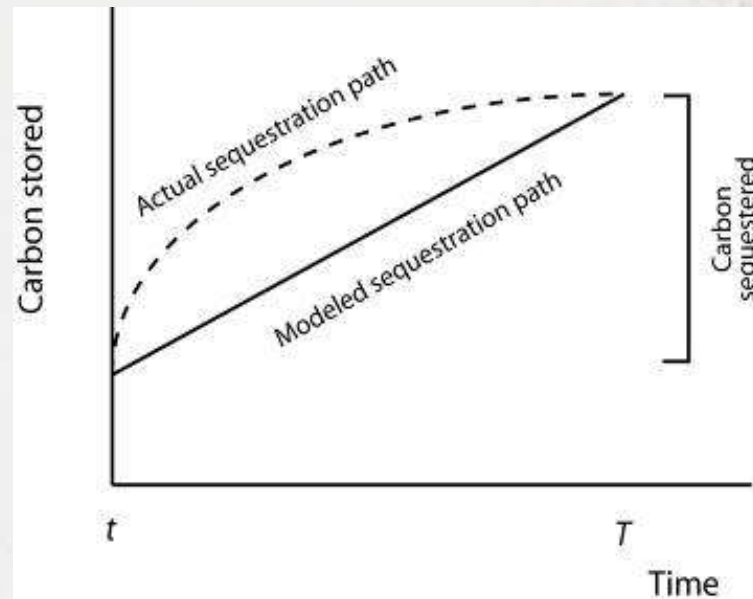
OUTPUT

- Map of current carbon storage (Mg C / cell)
- Map of future carbon storage – if future land use provided
- Carbon sequestration (future – present storage)
- Map of economic value of carbon sequestered



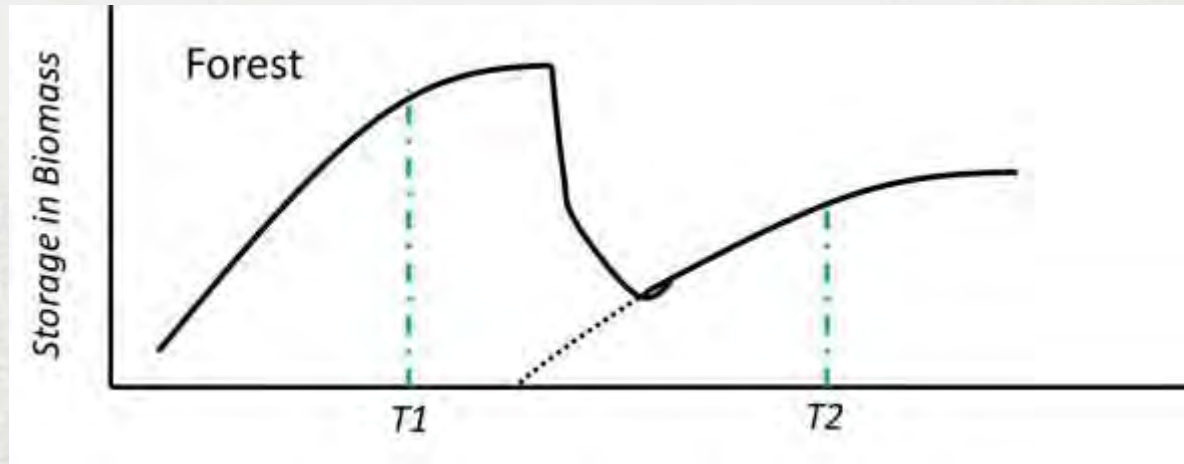
LIMITATIONS

- Simplified carbon cycle
- Economic variation assumes a linear trend in sequestration over time
- Output is only as detailed and reliable as land use classes and carbon pool data
- Carbon sequestration does not occur in an area unless LULC changes over time or wood is harvested



FUTURE STEPS

- Add dynamics via time scale between current and future land uses
- Allow for an intermediate land use map to account for vegetation change dynamics



Q & A