

# Predicting Effects of Climate and Landuse Change on Human Well-Being via Changes in Ecosystem Services

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# Climate and Landuse Change Impacts on Ecosystem Services and Well-being

## National Climate Assessment (2014)

- Reduced ability to regulate water quality and quantity
- Reduced ability to buffer extreme events
- Loss and degradation of soil and water assets for agriculture
- Alterations in biodiversity
- Choices about future landuse will affect vulnerability to climate change
- Expected to threaten human well-being



# Climate and Landuse Change Impacts on Ecosystem Services and Well-being

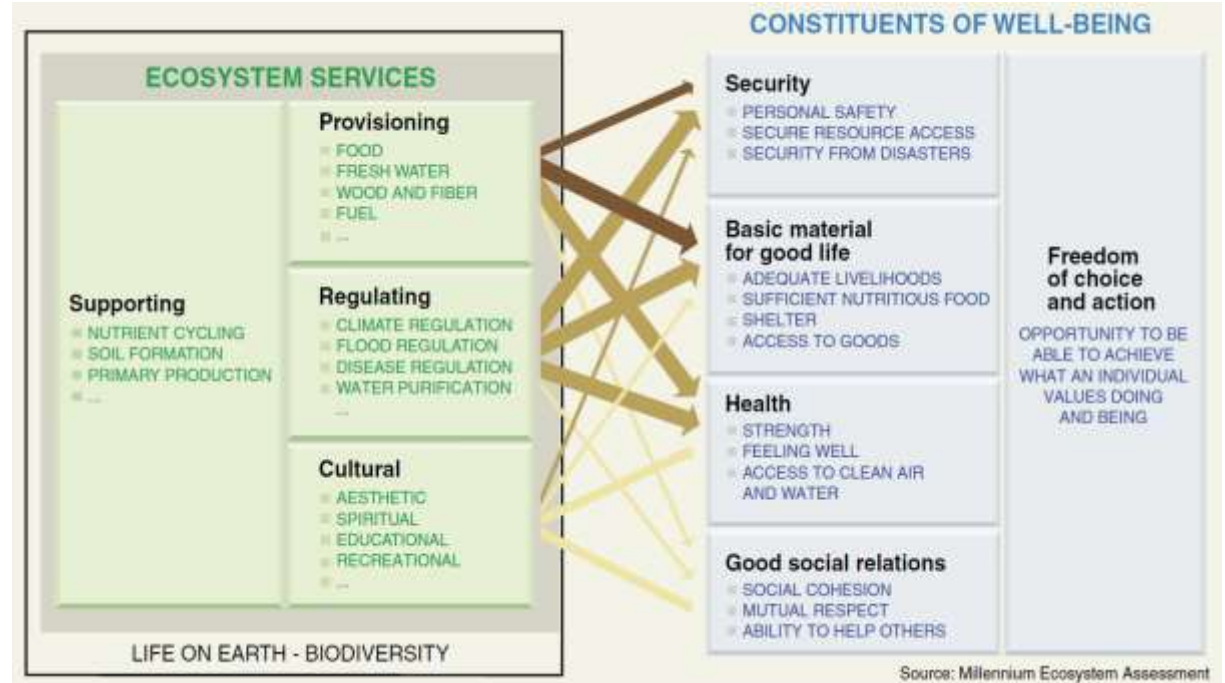
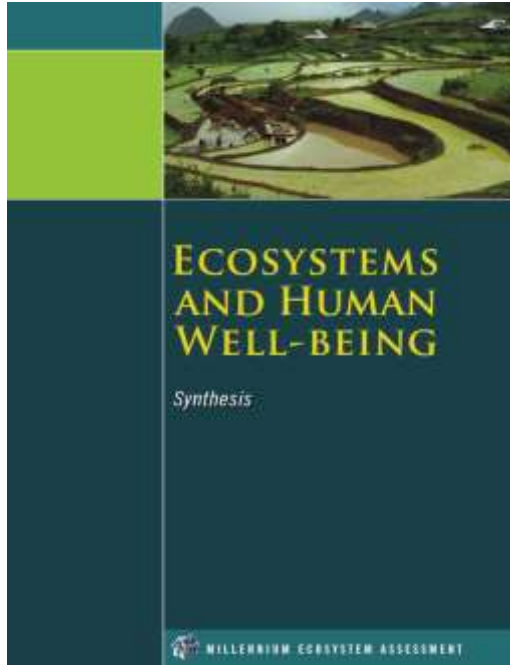
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**Can we quantitatively predict impacts of climate and landuse change on human well-being resulting from impacts on ecosystem services?**

# Ecosystem Services and Human Well-being

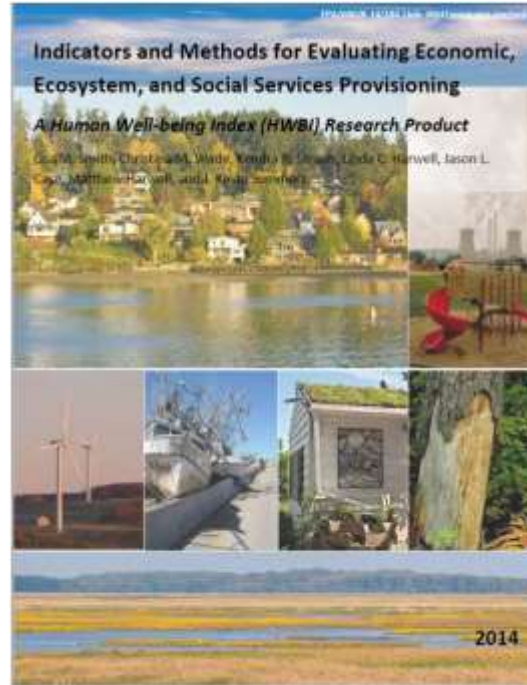


# Quantifying Relationships between Ecosystem Services and Human Well-being

Human Well-Being Index  
(HWBI)



Services

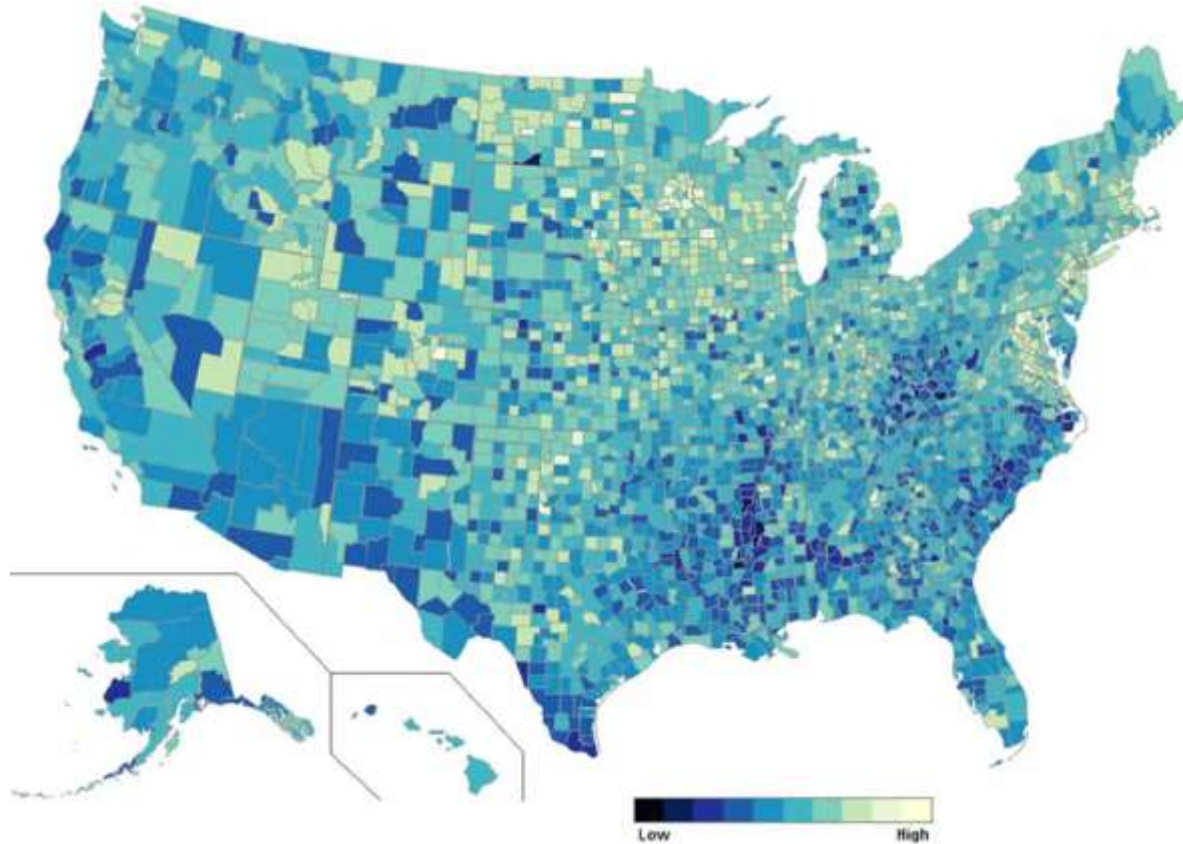


Services -> Well-being



Smith et al. 2012, 2014a, 2014b

# 1. County-level Time-Series and Maps of HWBI, 2000-2010

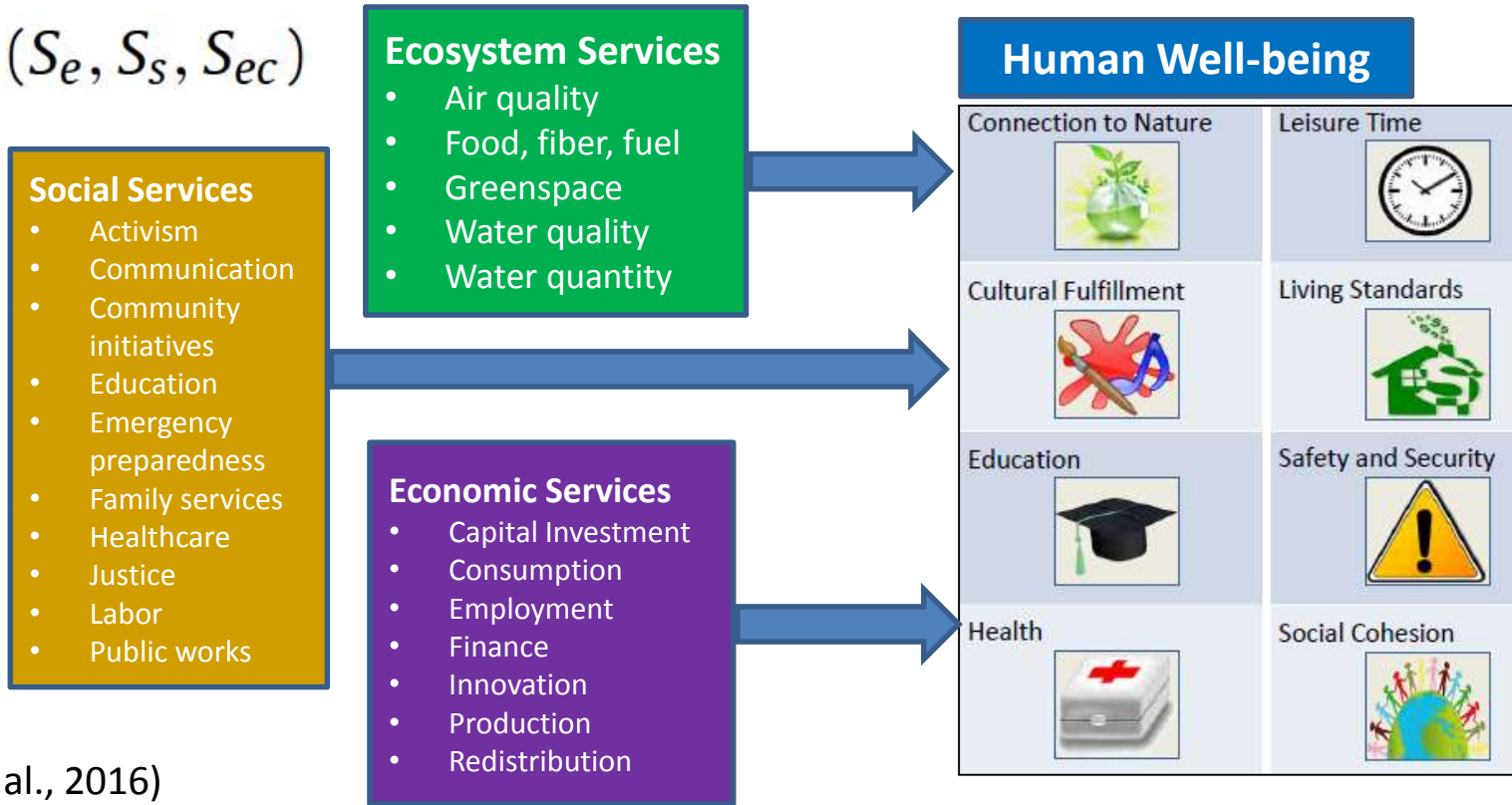


Connection to Nature 	Leisure Time 
Cultural Fulfillment 	Living Standards 
Education 	Safety and Security 
Health 	Social Cohesion 

Index based on 80 metrics of well-being

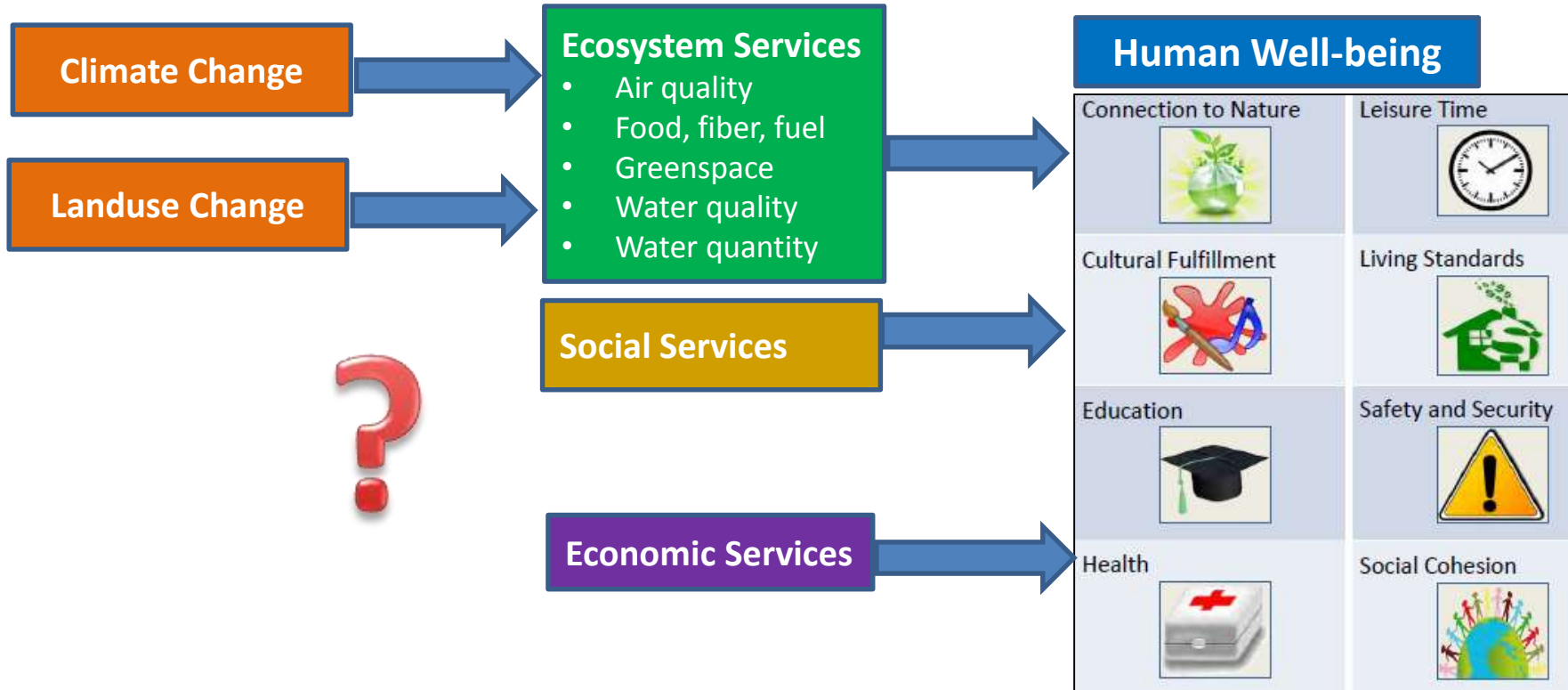
## 2. Regression Models Relating Indicators of Ecosystem Services to Domains of Human Well-being

$$HW_d = (S_e, S_s, S_{ec})$$



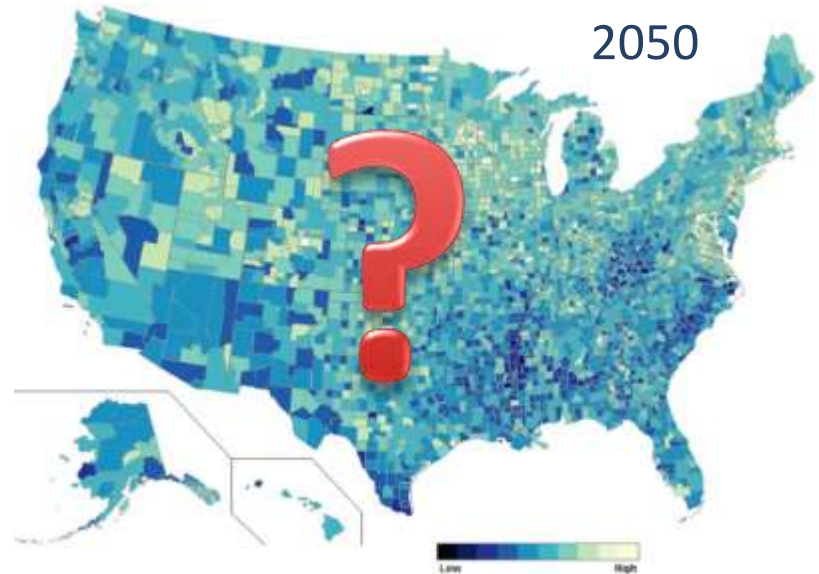
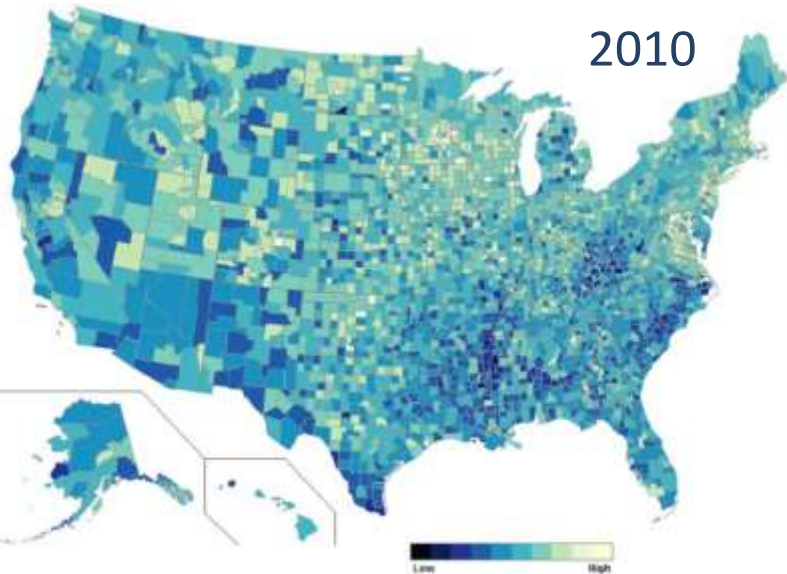
(Summers et al., 2016)

# How will Climate and Landuse Change Impact Ecosystem Services and Human well-being?





# Can we predict future human well-being, given expected climate & landuse impacts on ecosystem services?

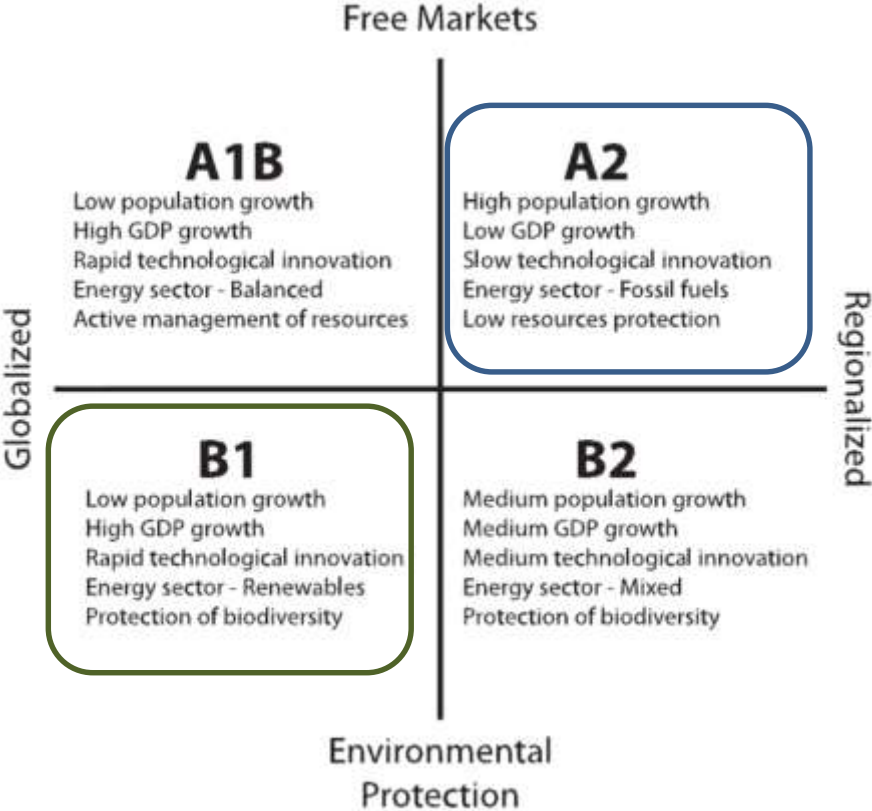


# Methods

- Proof of Concept for Pensacola, FL watershed
- Identify future climate/landuse scenarios
- Identify ecological production functions to translate landcover into ecosystem services
- Apply HWBI regression models to translate ecosystem services into well-being
- Data and models integrated into spatially-explicit dynamic modelling software: Envision

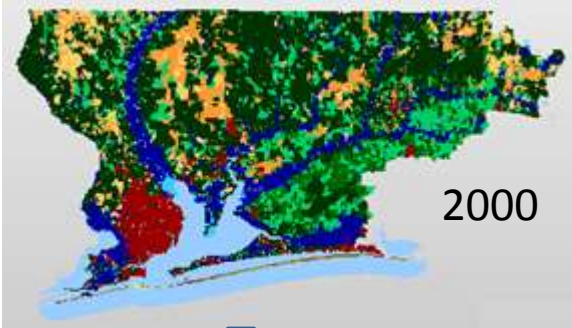


# Methods: Future Landuse Scenarios



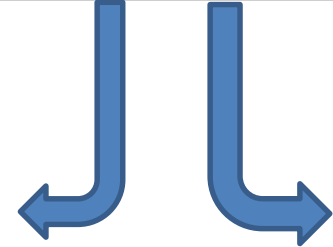
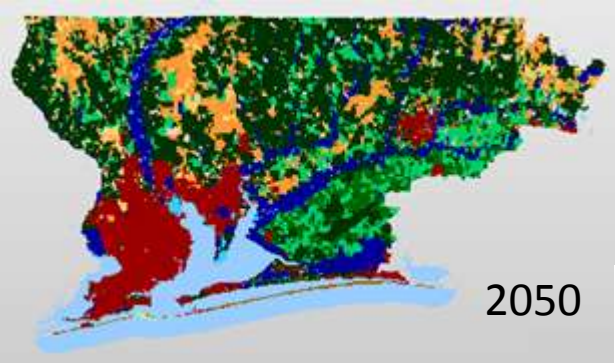
# Methods: Future Landuse Scenarios

Fore-SCE (USGS)

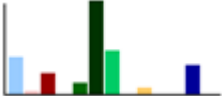
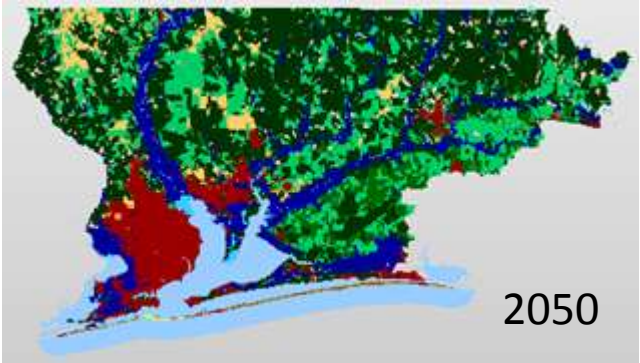


- Water
- Developed Open
- Developed
- Barren
- Deciduous Forest
- Evergreen Forest
- Mixed Forest
- Grassland
- Hay and Pasture
- Agriculture
- Woody Wetland
- Herbaceous Wetland

IPCC Scenario A2

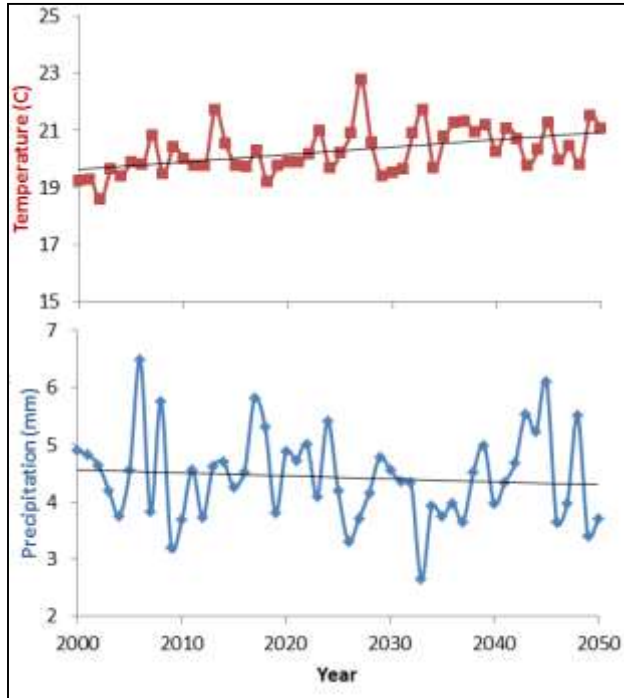


IPCC Scenario B1

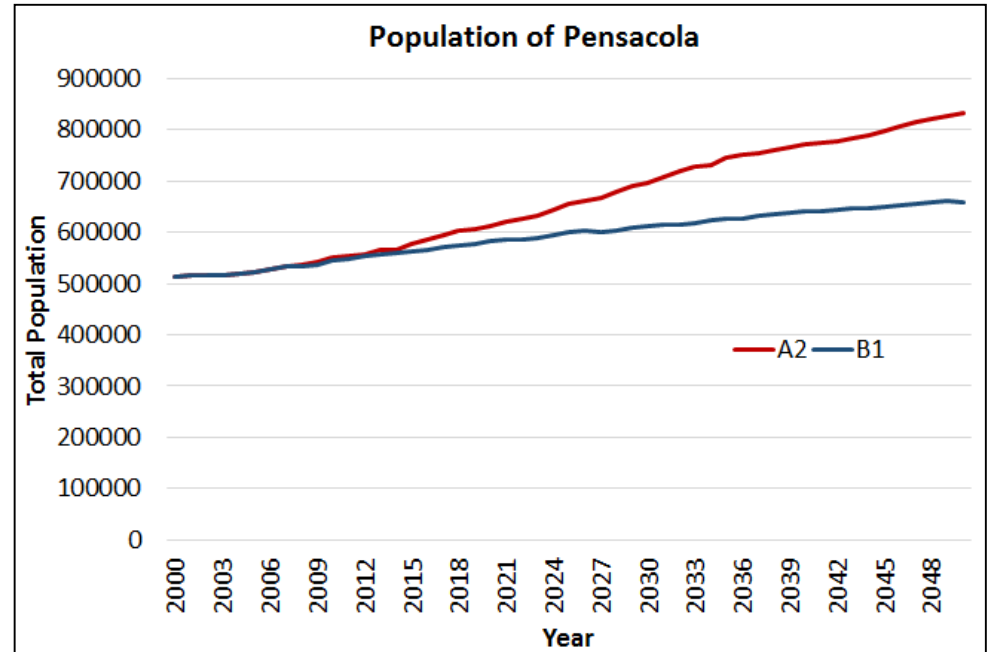


# Methods: Future Scenarios

## Precipitation and Temperature (MACA Downscaled Climate Data)



## Population Density Based on 2010 mean density per LULC



# Methods: Ecosystem Services Production Functions

SERVICE	INDICATORS	NUMBER OF METRICS
Air Quality 	Usable Air	1
Food, Fuel and Fiber Provisioning 	Energy	4
	Food and Fiber	3
	Raw Materials	5
Greenspace 	Natural Areas	4
	Recreation and Aesthetics	3
Water Quality 	Usable Water	2
Water Quantity 	Available Water	2

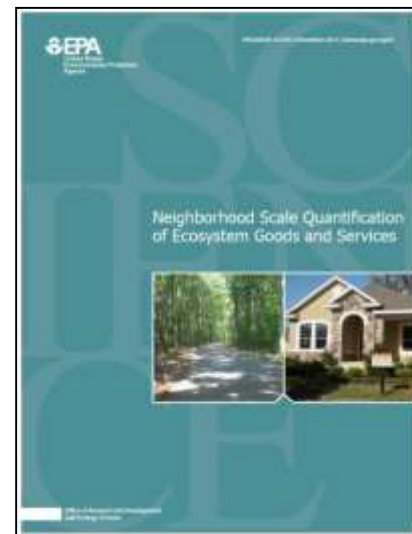
Identify surrogate metrics that could be modelled as a function of landuse, climate, ecosystem condition



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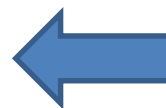
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*Russell et al. 2013*

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Air pollutant removal

- Canopy cover

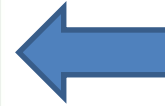


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Timber Volume

- Forest cover available for harvest

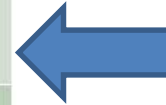
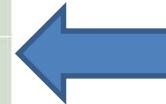


Agricultural Productivity

- Carbon into soil
- Nitrogen fixation
- Soil water content
- Look up tables based on LULC

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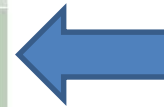
- Energy & Raw Materials
- Gold, silver, coal, oil reserves
  - Assumed unaffected by climate/landuse change

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## Natural Areas

- Cover of greenspace
- National Parks (assumed not to change)



## Recreation & Aesthetics

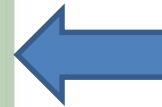
- Bluespace – water per population
- Biodiversity – based on mean richness per landuse type

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## Water quality

- Sediment retention (USLE)
- Nutrient retention (Invest)
- Fecal coliform retention (HSPF)
- Retention rates based on landcover
- HBV to model hydrology



# Methods: Ecosystem Services Production Functions

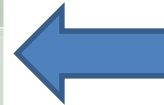
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Rainwater retention

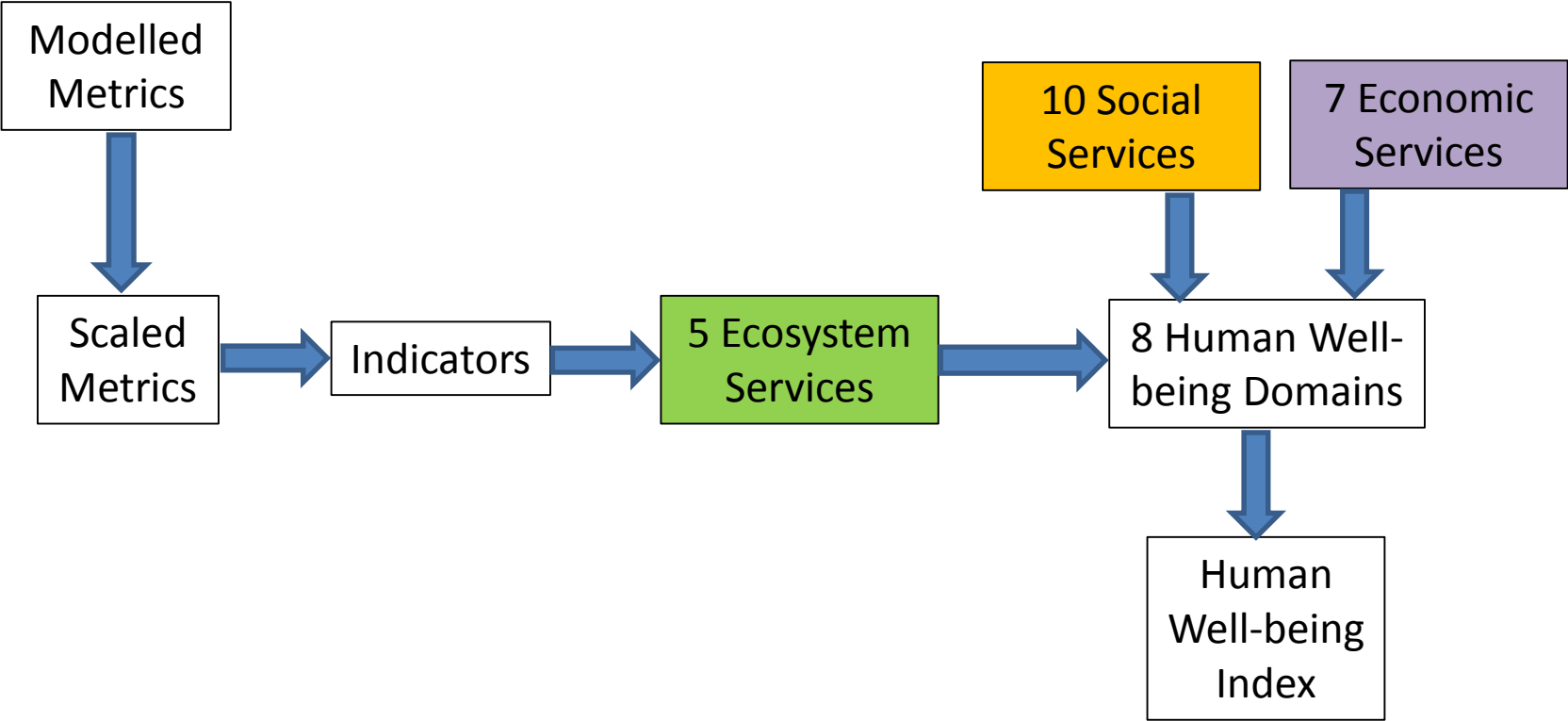
- curve number method
- based on mean soil type in each LULC

Water Sustainability Index

- assumed not to change



# Methods: Calculate Human Well-Being Index



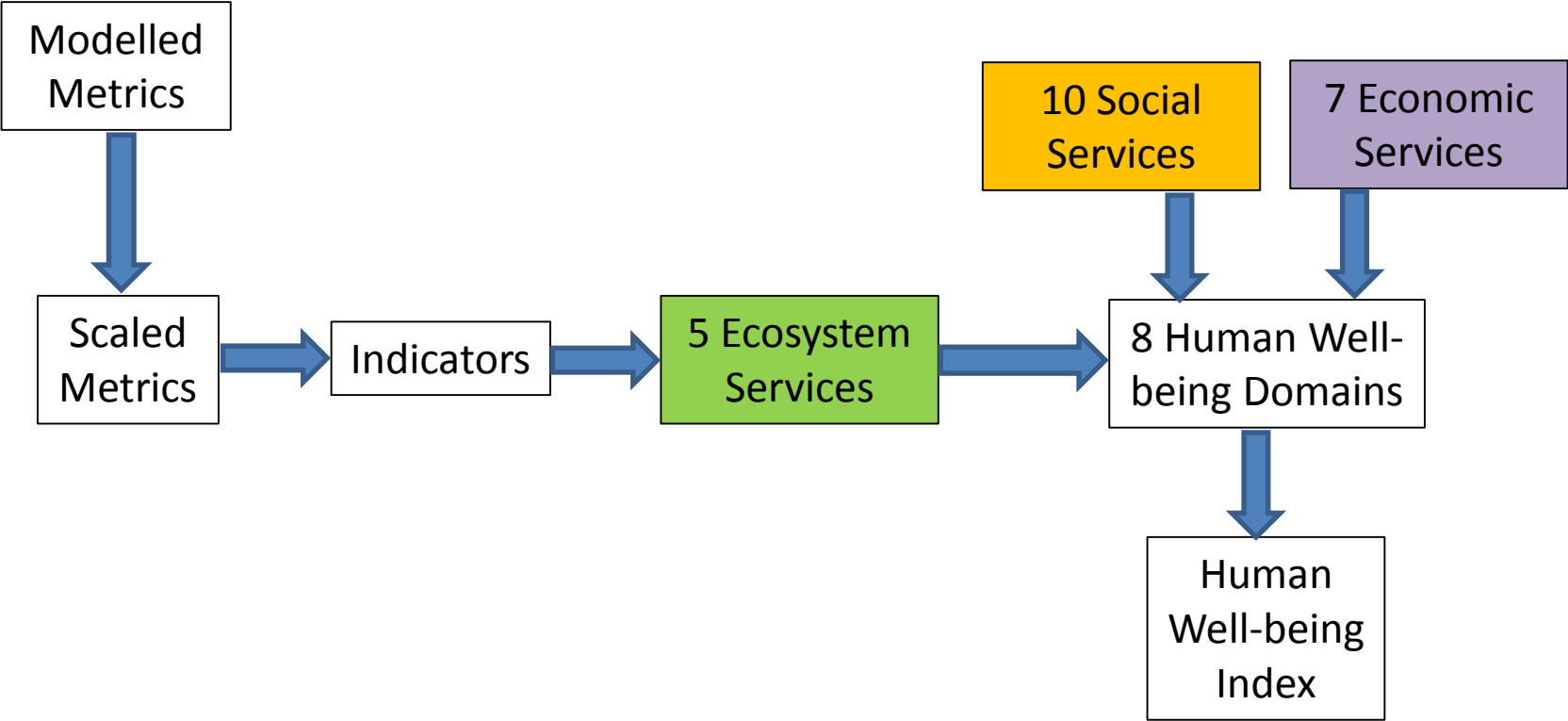
# Methods: Regression Coefficients Linking Services to Domains

Regression coefficients (*Summers et al. 2016*)

	Domains							
Services	Connection to Nature	Cultural Fulfillment	Education	Health	Leisure Time	Living Standards	Safety & Security	Social Cohesion
Air Quality		-/+						+
Food/Fiber					+	+		
Greenspace	-		+		+		-	-/+
Water Quality	+				-	-	-/+	-
Water Quantity		-		+	-/+	+	+	

\*\*\*includes interactions with other variables

# Methods: Calculate Human Well-Being Index





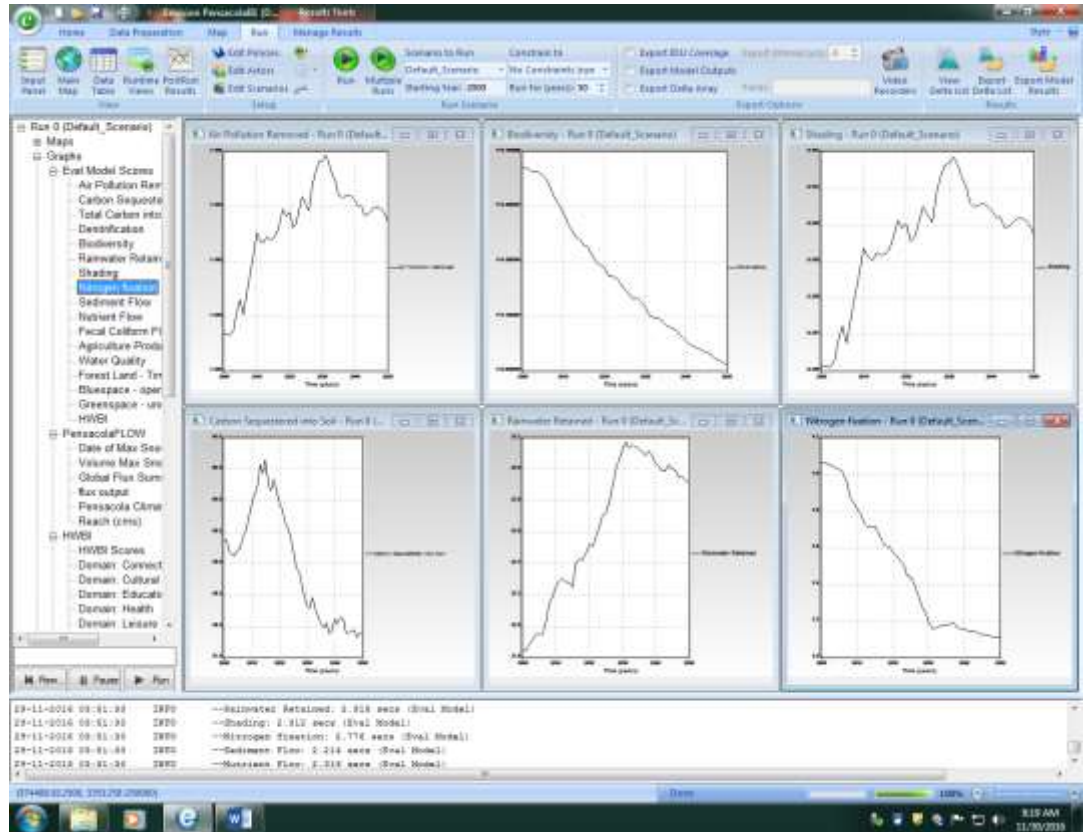
# Methods: Map Layers & Models Integrated in Envision

- Integrate different models into Envision software
- Open source, GIS
- Model plug-ins
- Alternative scenarios

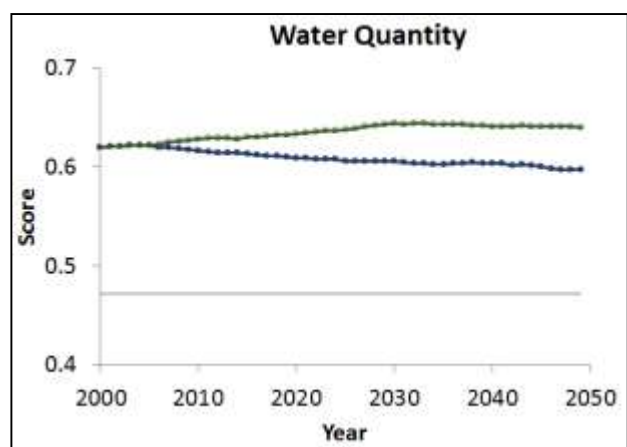
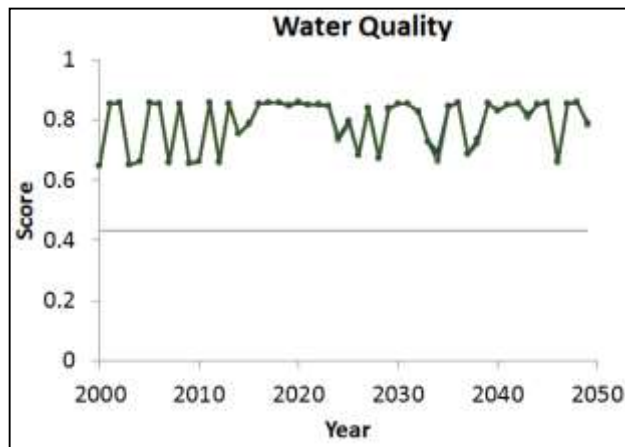
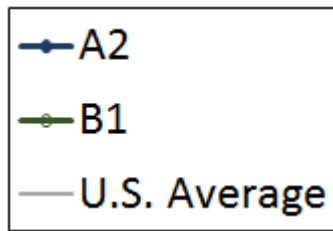
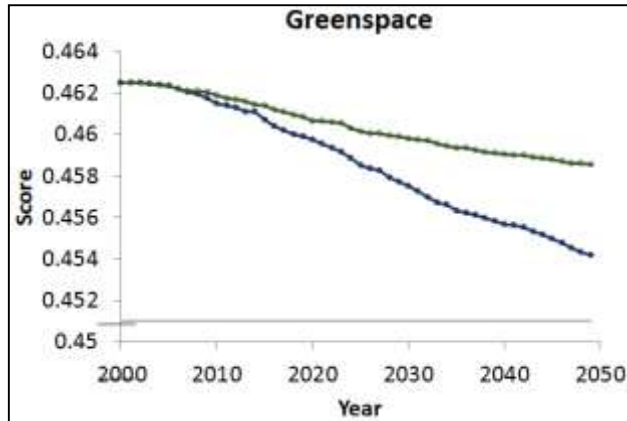
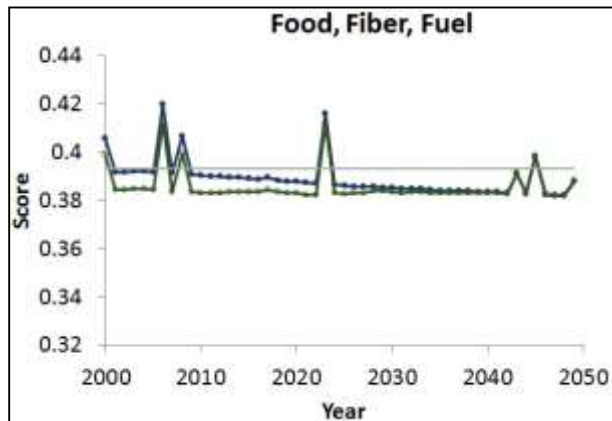
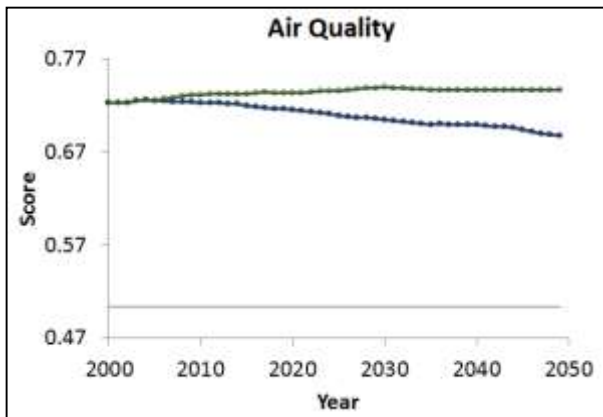


# Methods: Map Layers & Models Integrated in Envision

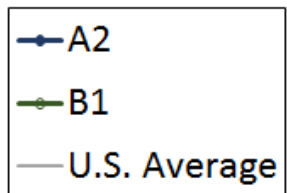
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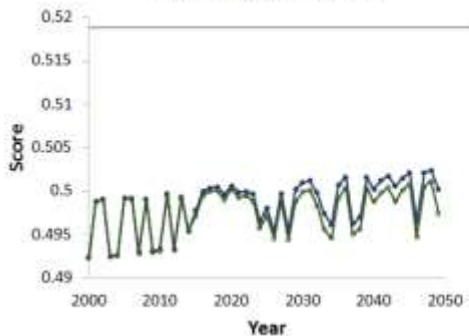
# Results: Ecosystem Services under Alternate Scenarios



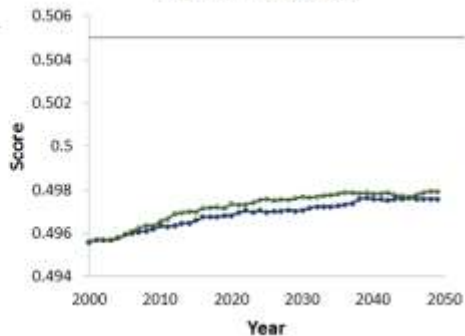
# Results: HWBI Domains under Alternate Scenarios



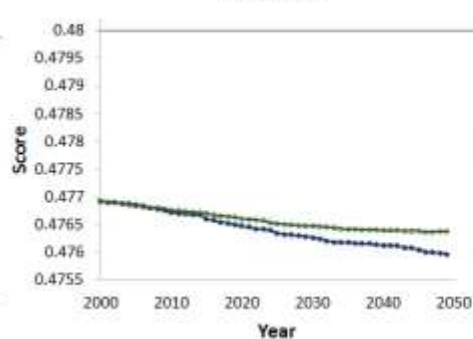
### Connection to Nature



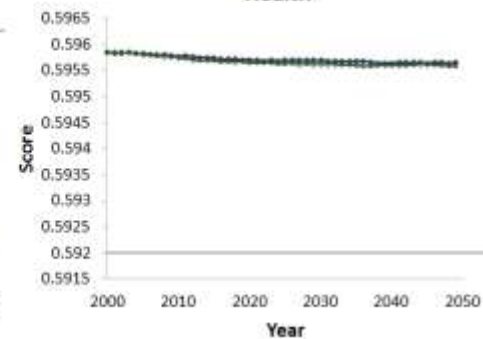
### Cultural Fulfillment



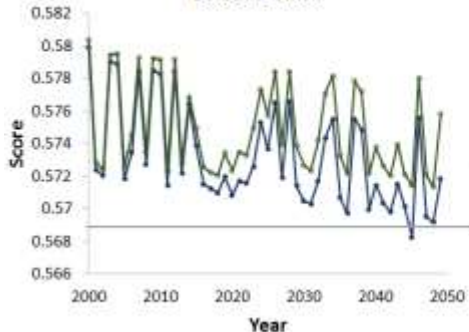
### Education



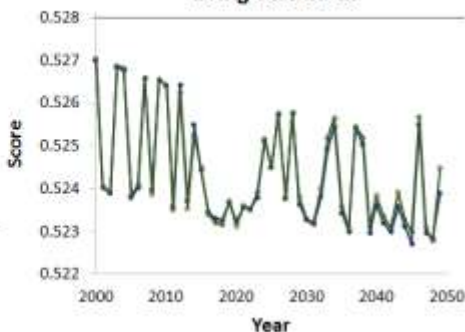
### Health



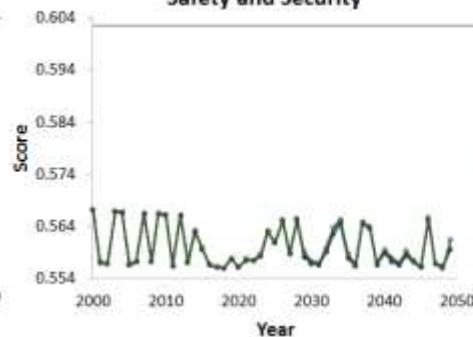
### Leisure Time



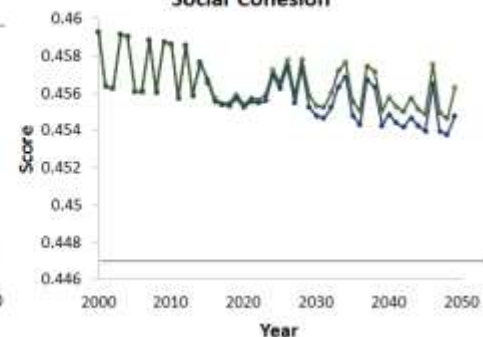
### Living Standards



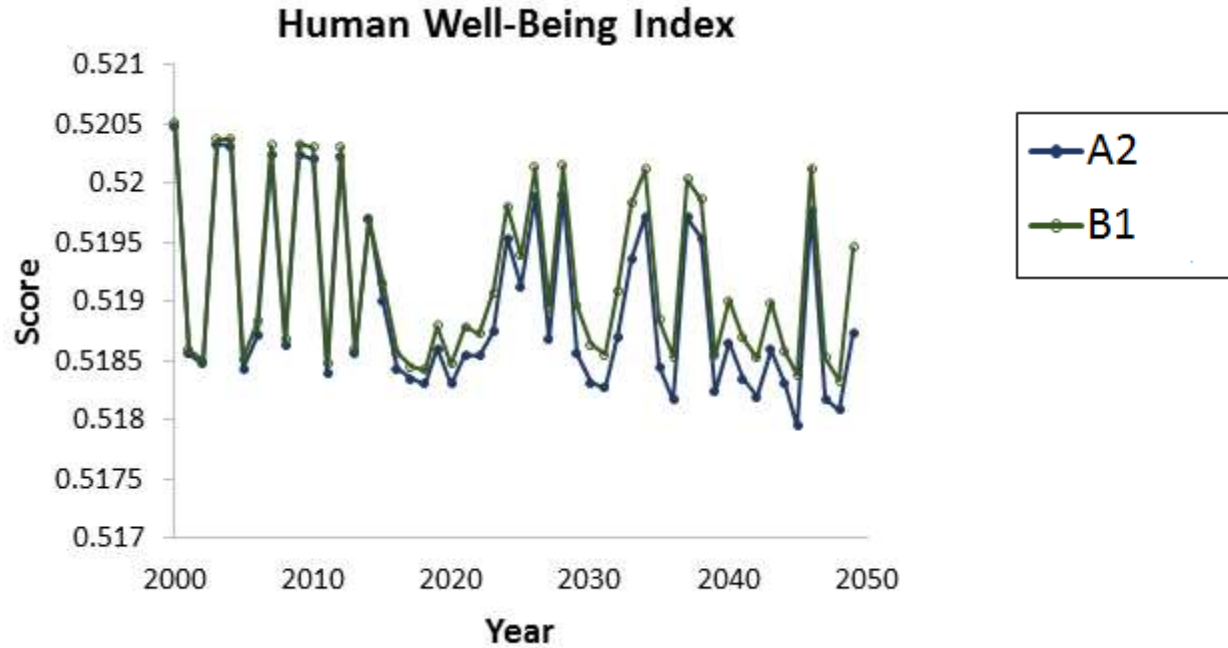
### Safety and Security



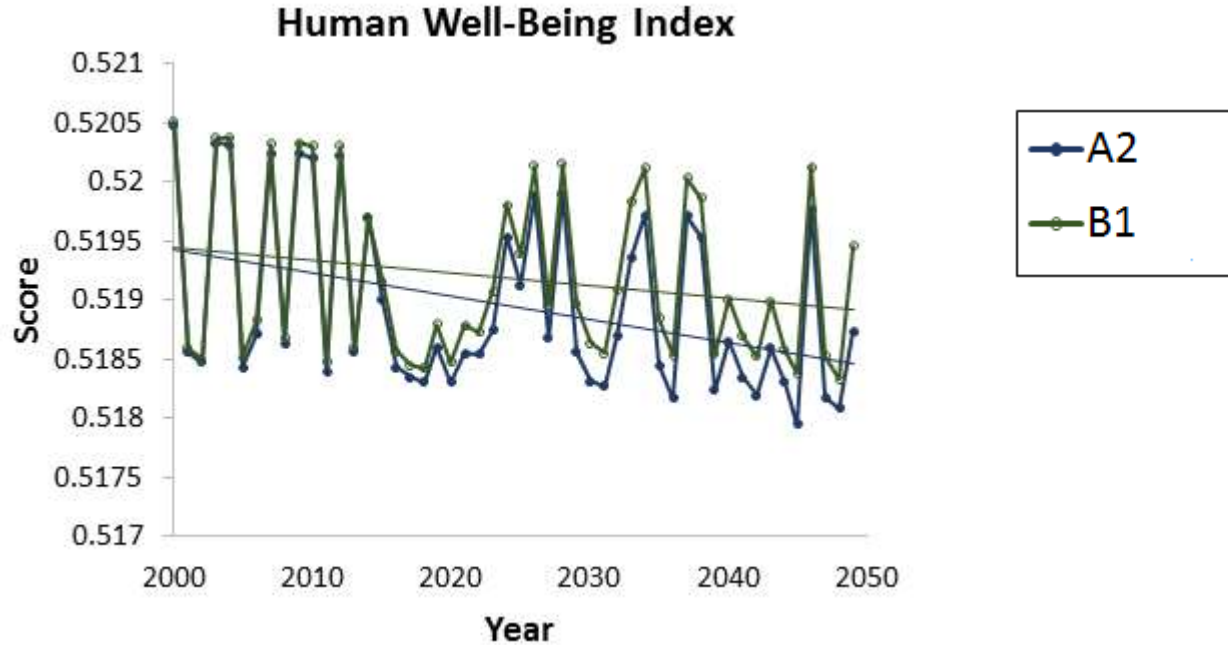
### Social Cohesion



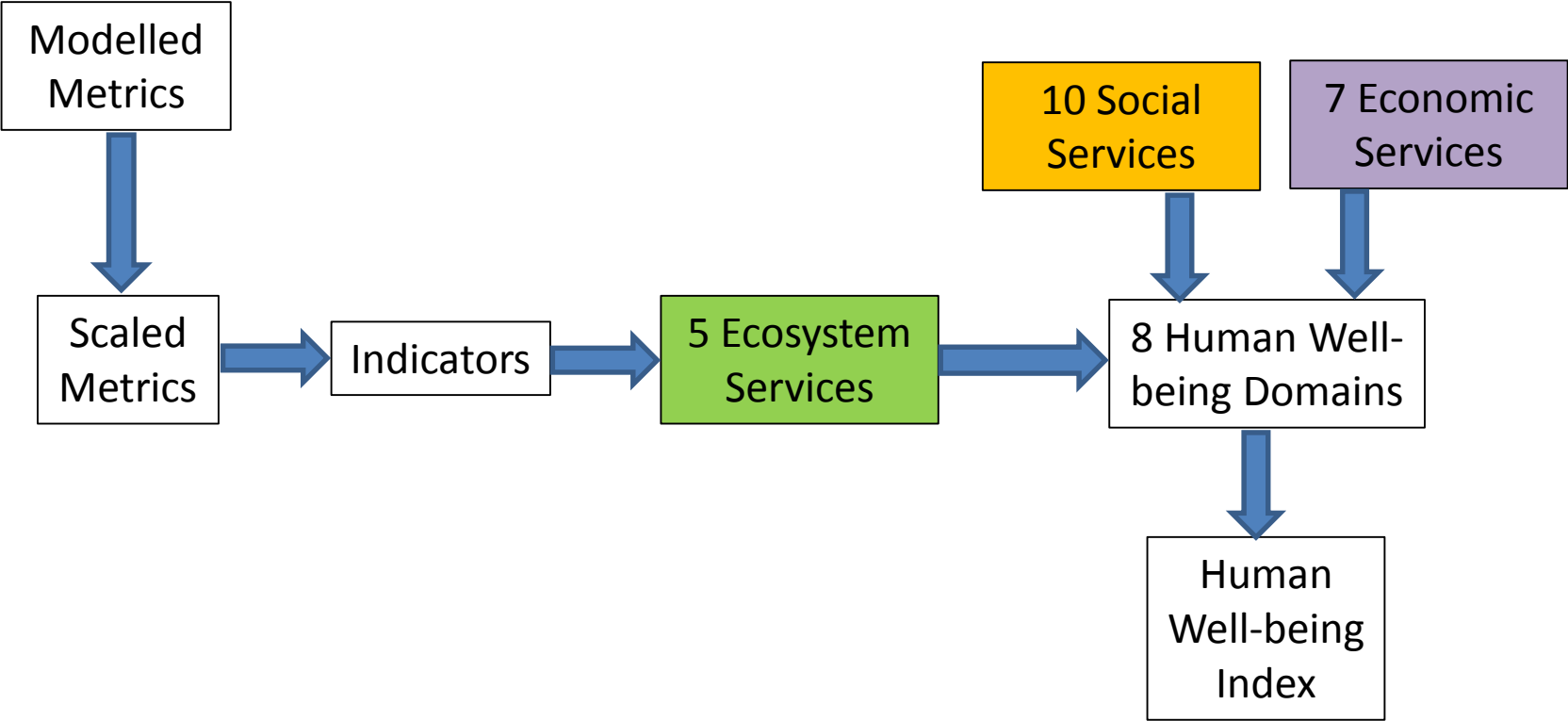
# Results: Composite HWBI under Alternate Scenarios



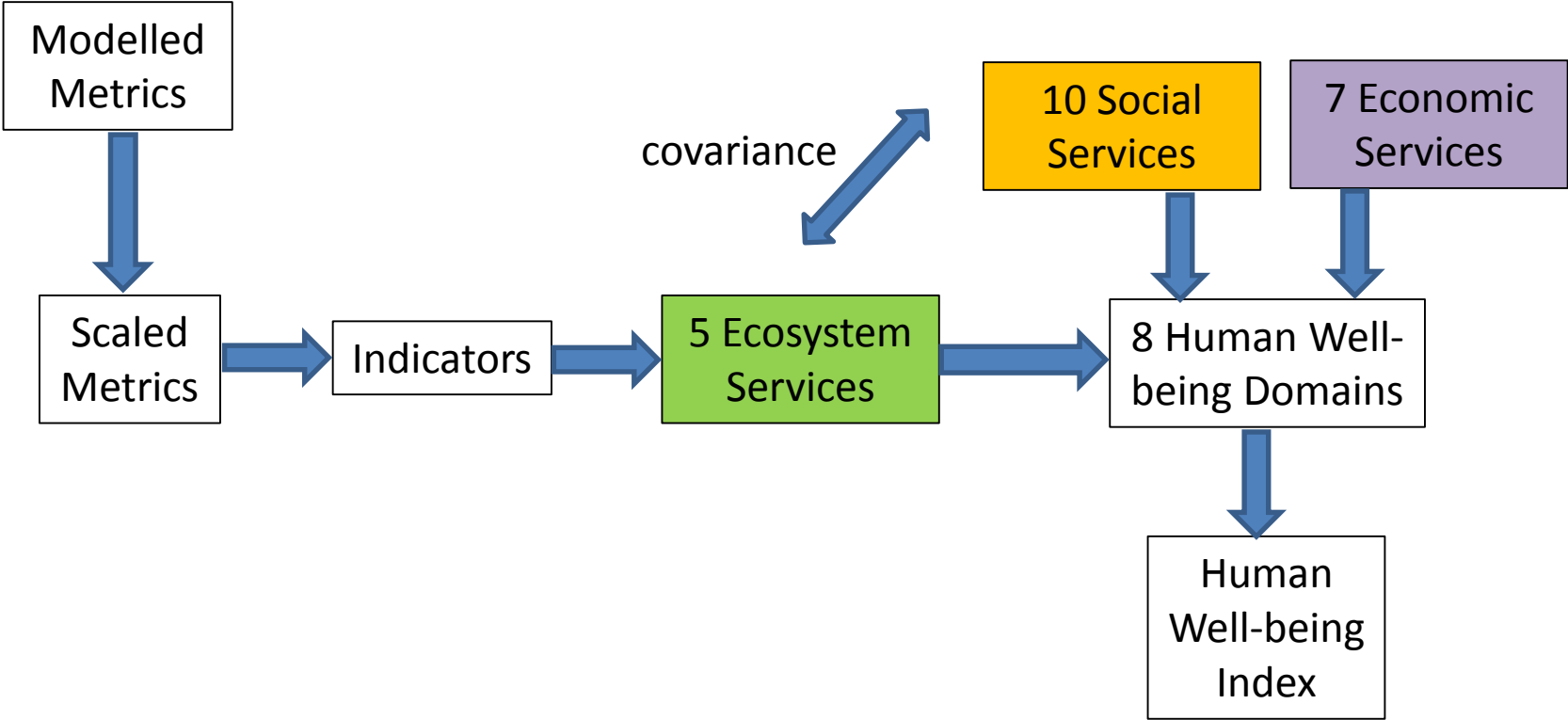
# Results: HWBI under Alternate Scenarios



# Methods: Calculate Human Well-Being Index



# Methods: Calculate Human Well-Being Index

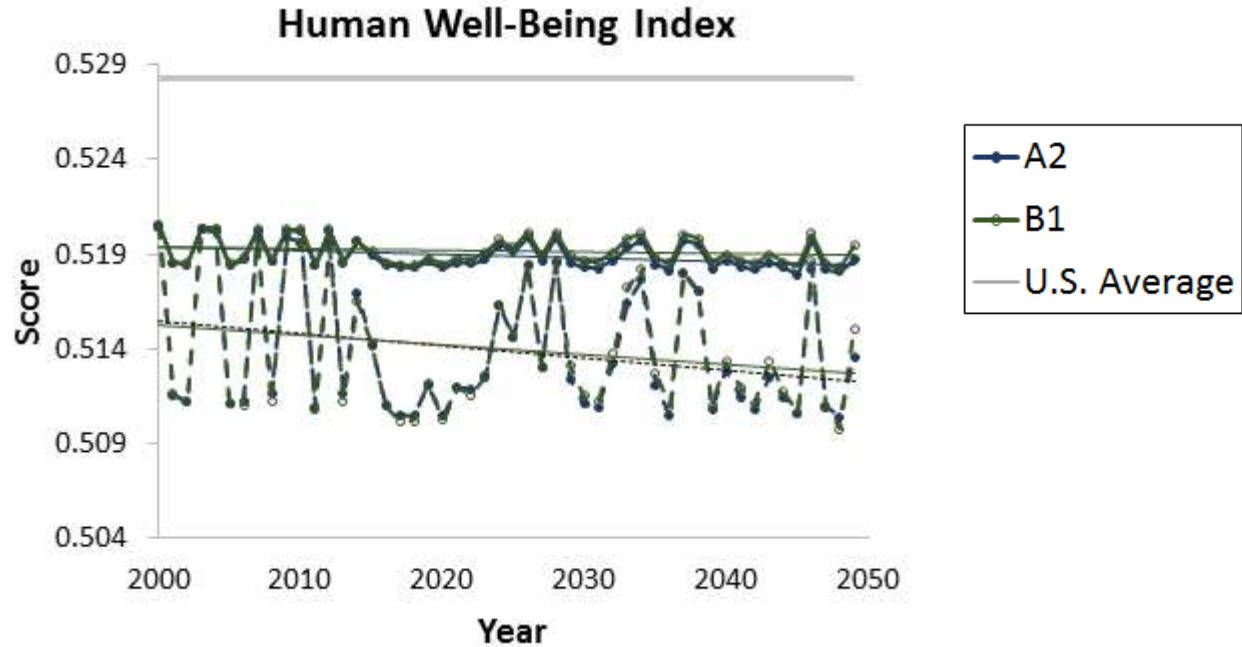




# Adjustment to Economic & Social Services Based on Covariance

	Economic Services							Social Services									
Ecosystem Services	Capital investment	Consumption	Employment	Finance	Innovation	Production	Re-distribution	Activism	Communication	Community Initiatives	Education	Emergency Preparedness	Family Services	Healthcare	Justice	Labor	Public works
Air Quality							+										
Food/Fiber	+	+	+	-		-		+			-	-	-	+			
Greenspace	+	+	+	-				+			-	-	-		+	-	
Water Quality	+	+		-				+			-	-	-		+		
Water Quantity										+	+			-			

# Results: HWBI under Alternate Scenarios



# Summary

- The specific development scenario (A2 vs. B1) effects whether ecosystem services are predicted to degrade with climate change & landuse
  - Air quality & water quantity projected to increase under “environmentally friendly” B1 scenario, but decrease under A2
  - Greenspace projected to decrease under both scenarios
- Human Well-being projected to decrease under both scenarios
  - Decreases at a slower rate under B1 scenario
  - Largely reflects declines in education, leisure time, living standards, social cohesion

## Next steps

- Apply relative importance values on HWBI domains
- Explore co-varying effects with Social & Economic Services
- Incorporate IPCC Scenario projections on energy reserves & emissions
- Investigate uncertainty associated with model parameters
- Investigate transferability to other locations
- Apply methods to investigate specific management and development scenarios (e.g., green infrastructure, restored wetlands)

