



# living planet BONN 23-27 May 2022

TAKING THE PULSE
OF OUR PLANET FROM SPACE



Ecosystem Integrity from an Explainable Artificial Intelligence perspective

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### Accuracy, explainability and interpretability



#### **Deep NN**

- Transparency: a model is transparent if, by itself, it has the potential to be understandable.
- Interpretability: is defined as the capacity to provide interpretations in terms that are understandable to a human.
- Explainability: is related with the notion of explanation as an interface between humans and an AI system.

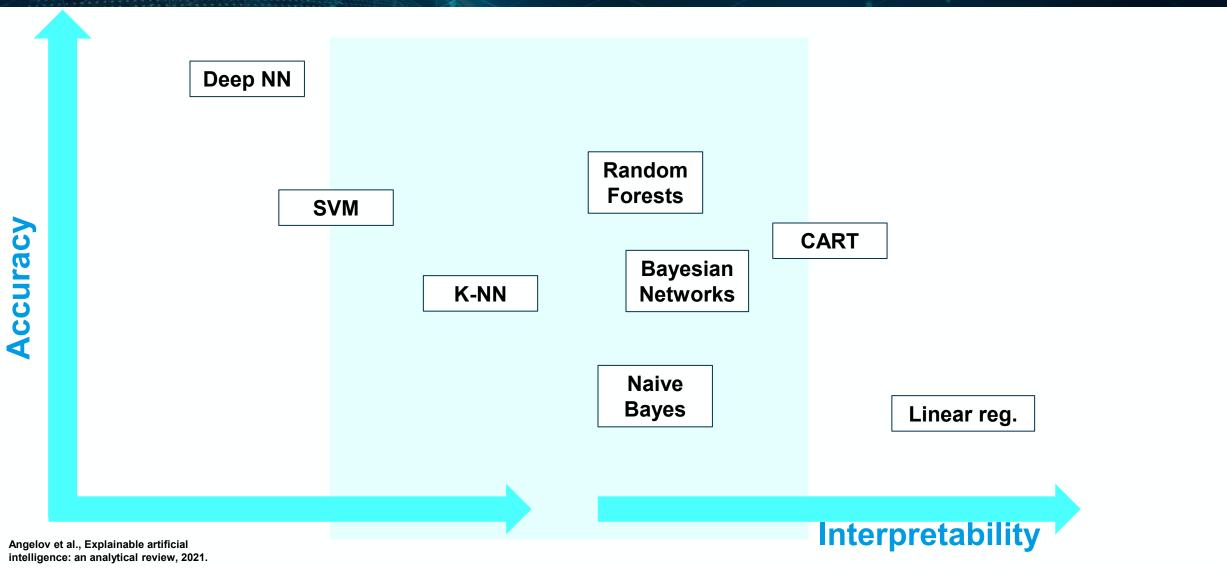
Naive Bayes

Linear reg.

Interpretability

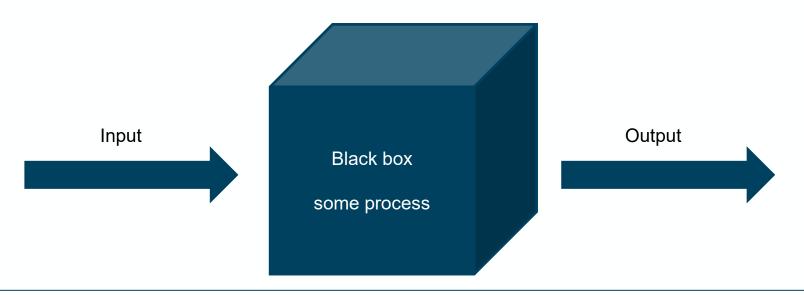
### Accuracy, explainability and interpretability





#### Accuracy, explainability and interpretability





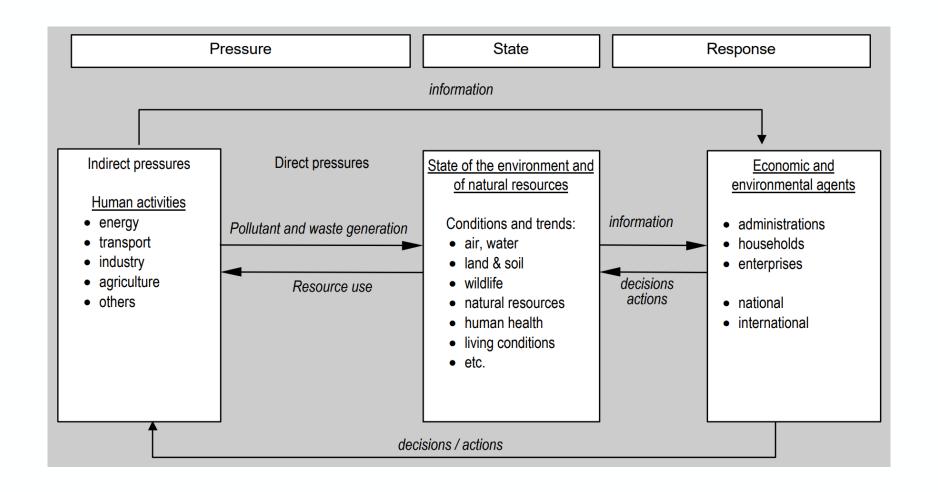
Stop Explaining Black Box Machine Learning Models for High Stakes Decisions and Use Interpretable Models Instead

> Cynthia Rudin Duke University

# Sustainability is a high-stakes problem

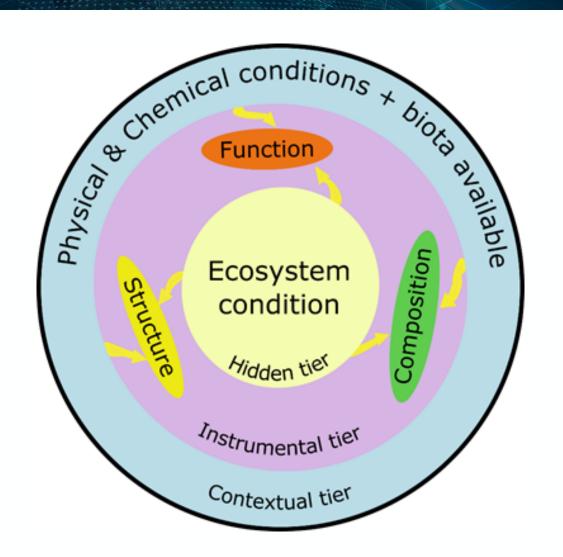
#### Pressure, state, response models

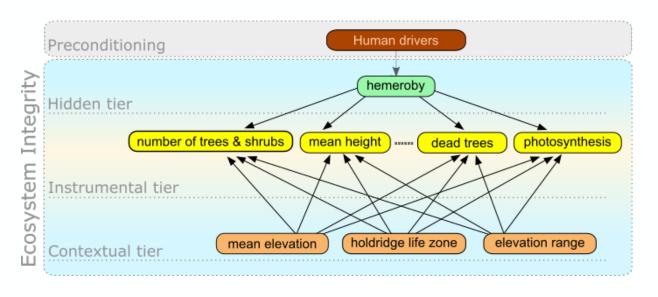




#### **Ecosystem integrity as a three tier DAG**



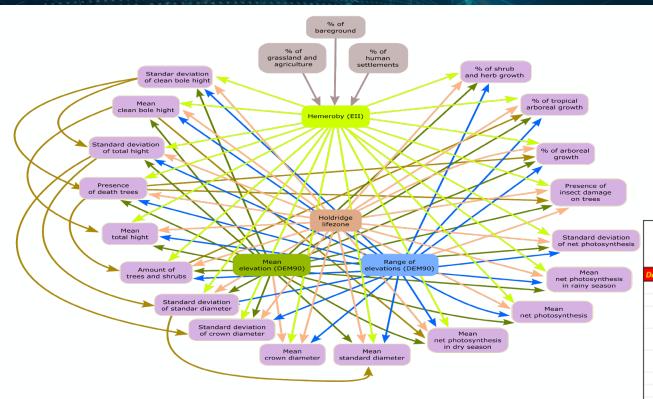




#### Ecosystem integrity as a three tier DAG



STATUS:



#### QUALITATIVE AMOUNT OF CHANGE FROM PRIMARY VEGETATION TO "CURRENT" LAND USE AND VEGETATION

^	NO CHANCE OF PECETATION OF PRIMARY STATE	CTACIC
-	NO CHANGE OF VEGETATION OR PRIMARY STATE	STASIS
	NO CHANGE IN PRIMARY STATE CONDITION, THE CHANGE IS IN VEGETATION TYPE BUT INSIDE THE SAME ECOVARIANT (e.g. FOREST, SHRUBLAN, GRASSLA	PSEUDOESTASIS
2	NO CHANGE IN PRIMARY STATE CONDITION, THE CHANGE IS IN VEGETATION TYPE TO ANOTHER ECOVARIANT BUT WITH INCREASE IN THE HEIGHT OF	PSEUDOESTASIS
2	THE DOMINANT STRATUS (e.g. from SHRUBLAND to WOODLAND)	PSEODOESTASIS
	NO CHANGE IN PRIMARY STATE CONDITION, THE CHANGE IS IN VEGETATION TYPE TO ANOTHER ECOVARIANT BUT KEEPING THE HEIGHT OF THE	PSEUDOESTASIS
4	DOMINANT STRATUS (e.g. FROM OAK FOREST TO TROPICAL DECIDUOUS FOREST)	PSEODOESTASIS
	NO CHANGE IN PRIMARY STATE CONDITION, THE CHANGE IS IN VEGETATION TYPE TO ANOTHER ECOVARIANT BUT DECREASING THE HEIGHT OF THE	DEGRADATION
4	DOMINANT STRATUS (e.g. FROM SHRUBLAND TO GRASSLAND)	DEGRADATION
5	CHANGE FROM PRIMARY FORESTS TO ARBOREAL SECONDARY VEGETATION	DEGRADATION
6	CHANGE FROM ANY KIND OF PRIMARY VEGETATION TO INDUCED FOREST OR TREE PLANTATION	DEGRADATION
7	CHANGE FROM PRIMARY FORESTS, TROPICAL FORESTS, WOODLANDS OR SHRUBLANDS TO SHRUBBY SECONDARY VEGETATION	DEGRADATION
8	CHANGE FROM ANY KIND OF PRIMARY VEGETATION TO SAVANNA VEGETATION	DEGRADATION
9	CHANGE FROM ANY KIND OF PRIMARY VEGETATION TO HERBCEOUS SECONDARY VEGETATION	DEGRADATION
10	CHANGE FROM ANY KIND OF PRIMARY VEGETATION TO INDUCED PALM GROVE, OR INDUCED OR CULATIVATED PASTURE	DEGRADATION
11	CHANGE FROM NATURAL BODY OF WATER TO AQUACULTURAL USE	DEGRADATION
12	CHANGE FROM ANY KIND OF PRIMARY VEGETATION TO RAINFED AGRICULTURE	DEGRADATION
13	CHANGE FROM ANY KIND OF PRIMARY VEGETATION TO IRRIGATION AGRICULTURE	DEGRADATION
14	CHANGE FROM ANY KIND OF PRIMARY VEGETATION TO HUMIDITY AGRICULTURE	DEGRADATION
15	CHANGE FROM ANY KIND OF PRIMARY VEGETATION TO BODY OF WATER	DEGRADATION
16	CHANGE FROM ANY KIND OF PRIMARY VEGETATION TO BARE SOIL	DEGRADATION
17	CHANGE FROM ANY KIND OF PRIMARY VEGETATION TO HUMAN SETTLEMENTS OR IMPERILOUS SURFACES	DEGRADATION
18	CHANGE FROM ANY KIND OF PRIMARY VEGETATION TO URBAN ZONE OR IMPERILOUS SURFACE	DEGRADATION
-9999	NO DATA	~



















DESCRIPTION:









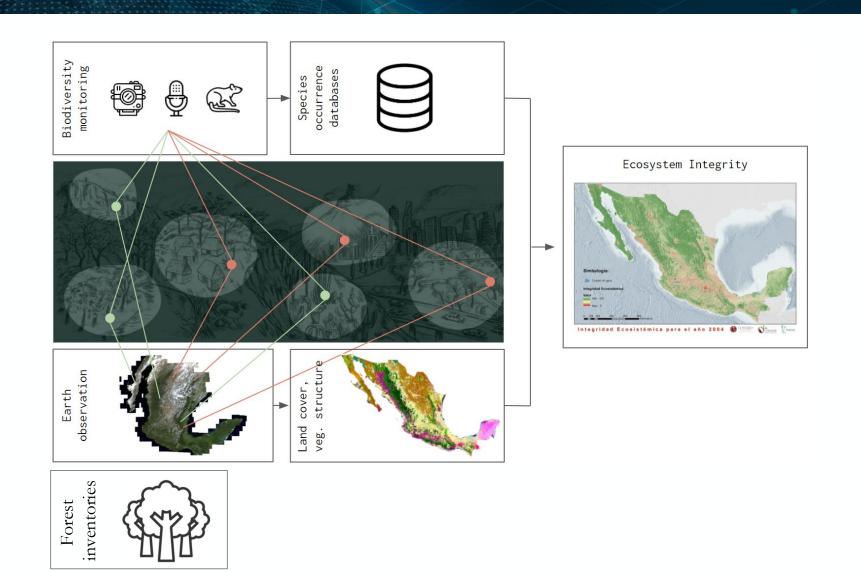






#### Data integration for ecosystem assessment

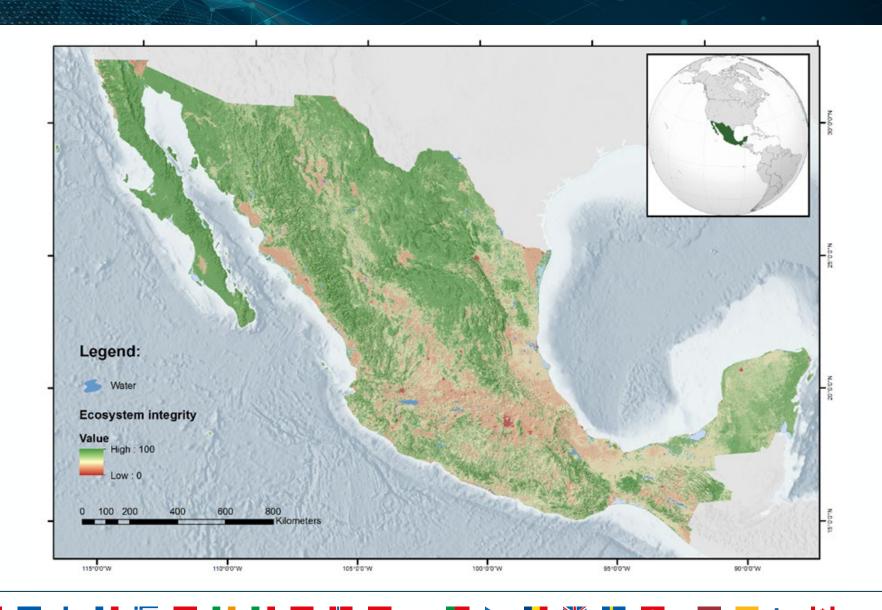






## The mexican experience





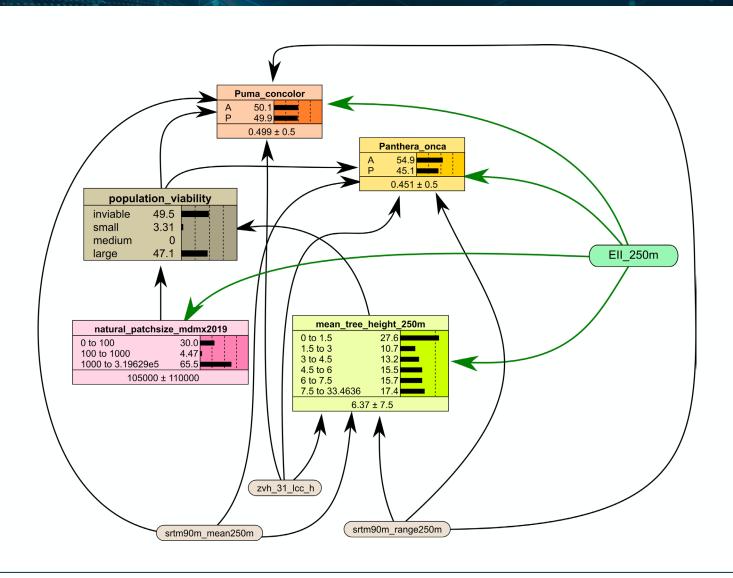
## The mexican experience





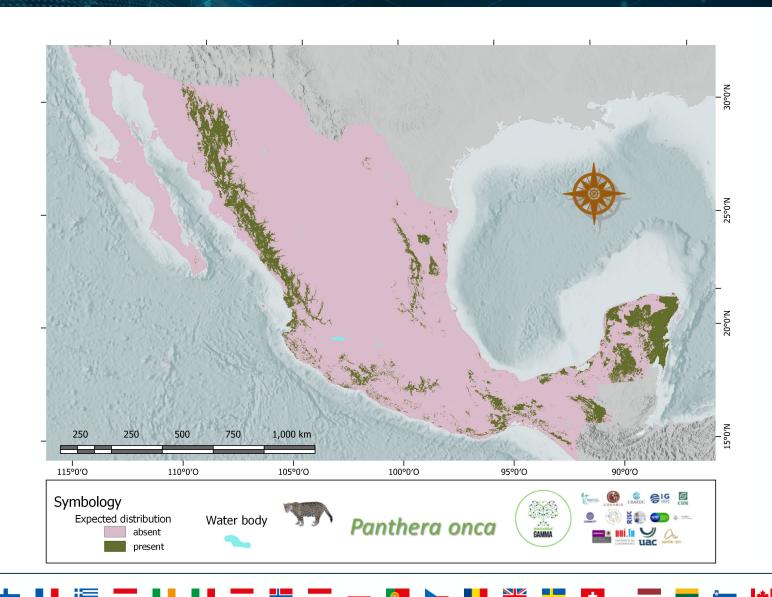
#### Fauna and data centric machine learning





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Data centric ML



