



# Project Platypus

A Collection of Libraries for Optimization, Data Analysis, and Decision Making  
Developed by David Hadka

<https://github.com/Project-Platypus>

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J3

J3S



# What is Project Platypus?

Python extension of  
the R package:



# OpenMORDM

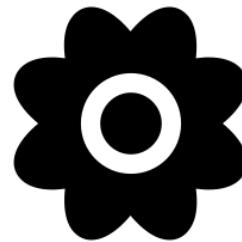
Multiobjective Robust Decision Making in R

<http://github.com/OpenMORDM>



Rhodium

Python tool for Robust  
Decision Making, built off of  
the EMA workbench



PRIM

Stand-alone Python  
implementation of the Patient  
Rule Induction Method



Platypus

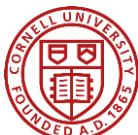
Python library of Multi-  
Objective Evolutionary  
Algorithms (MOEAs)

<https://github.com/Project-Platypus>

J3

J3

Java platform for visualizing  
and analyzing multi-objective  
trade-offs

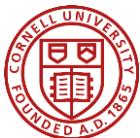


# What do robustness analyses have in common?

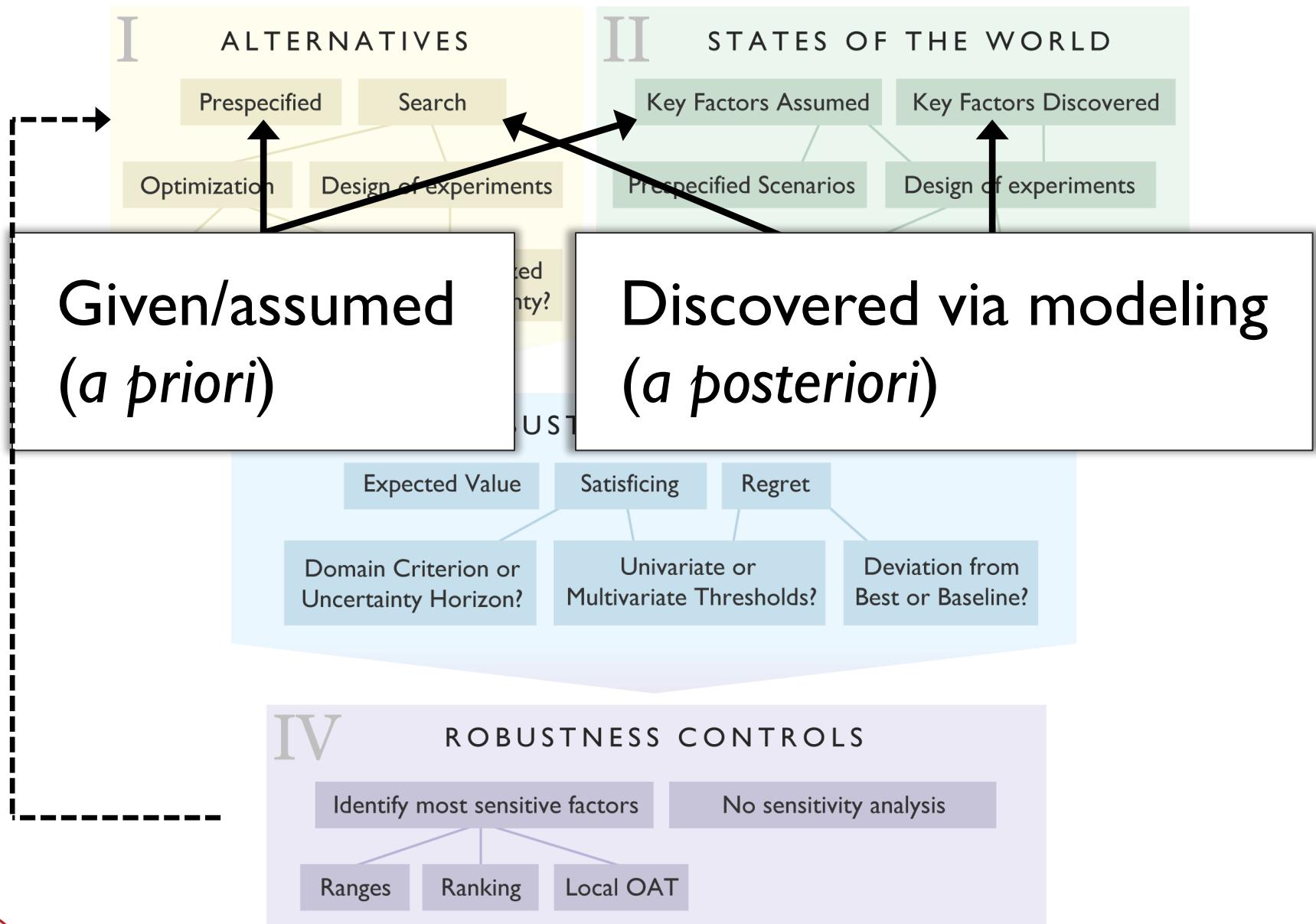
Evaluate alternatives in multiple states of the world...

Quantify robustness measures and determine sensitive uncertainties

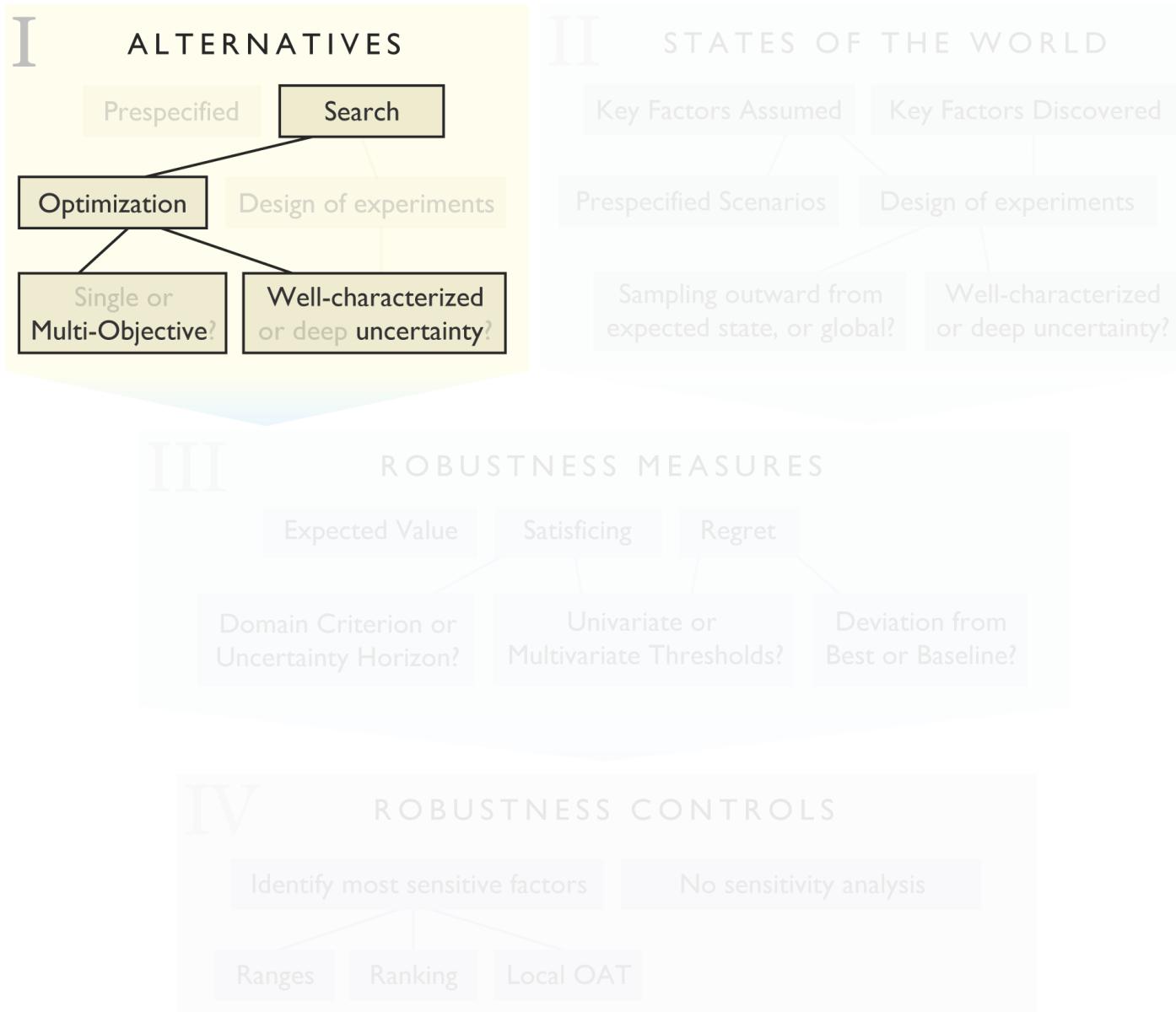
Slide credit: Jon Herman



# Taxonomy of Robustness Frameworks



# Taxonomy of Robustness Frameworks





# Platypus

## Evolutionary Algorithms / Optimization

Implementation of popular single  
and multi-objective EAs:

- NSGA-II, NSGA-III, MOEA/D, IBEA,  $\varepsilon$ -MOEA,  
SPEA2, GDE3, OMOPSO, SMPSO, CMA-ES,  
 $\varepsilon$ -NSGA-II
- Borg (available separately)

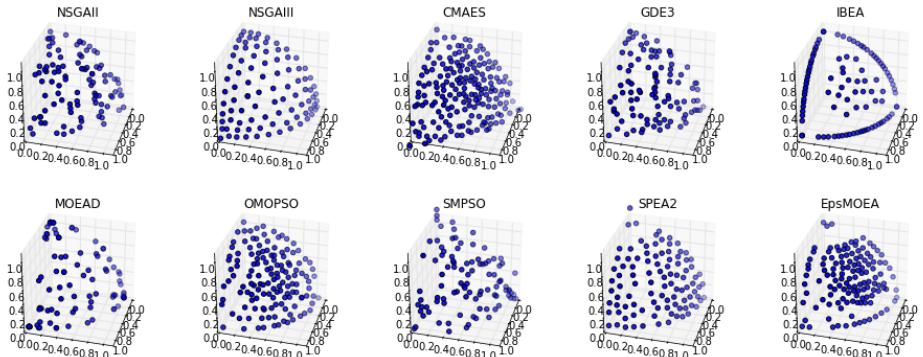
```
from platypus import NSGAIID, DTLZ2
problem = DTLZ2(3)
algorithm = NSGAIID(problem, divisions_outer=12)
algorithm.run(10000)
print(algorithm.result)
```

Supports parallelization

- Threads
- MPI

Experimentation framework:

- Execute many algorithms / problems /  
parameters
- Parallelization support



# T3 High Dimensional Visualizations in Java

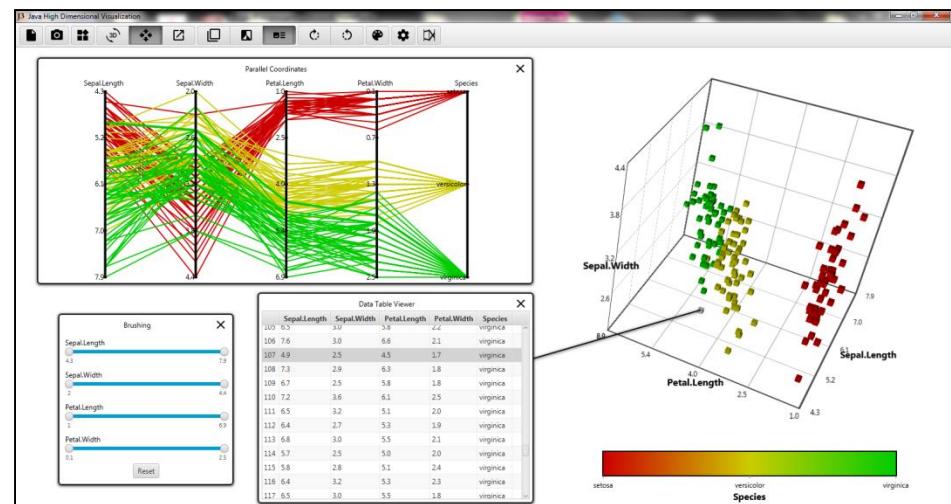
## Widget-based viewer

- 2D, 3D scatter plots
- Parallel coordinates
- Annotations, brushing
- Animations (**New**)
- Saving/loading (**New**)

## Cross Platform

- Installers for Windows, Mac, Linux

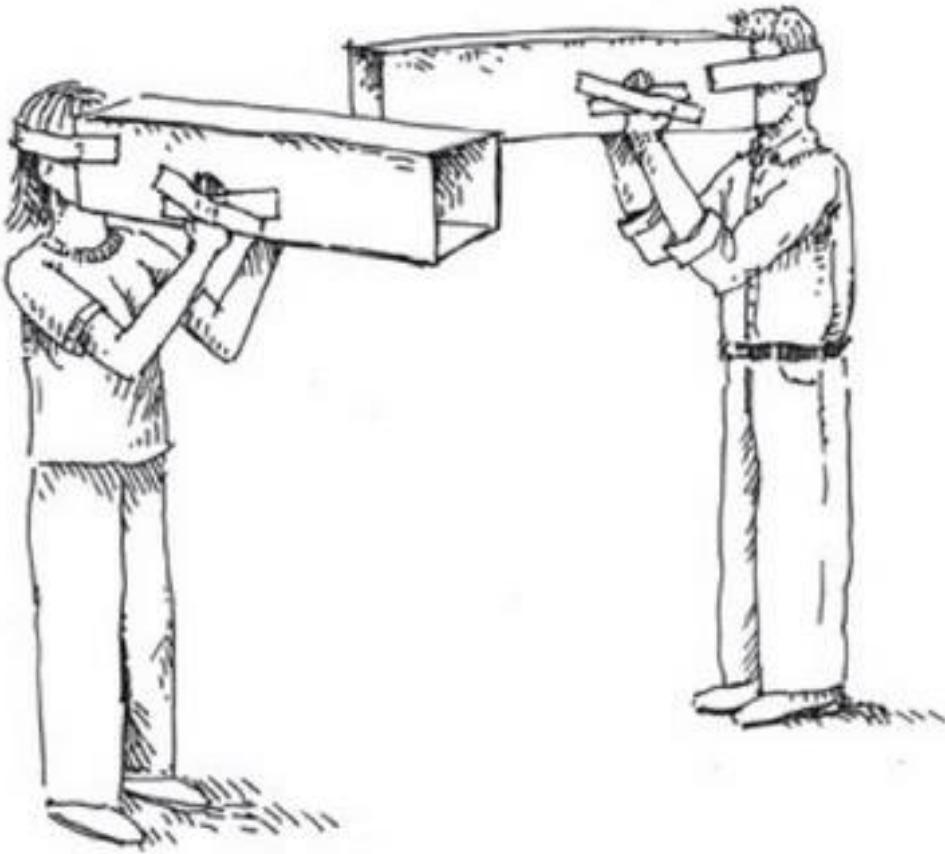
## Small Footprint (10 MBs)



## Plugin API for adding new widgets



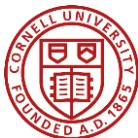
# Optimizing to a stationary future: too narrow?



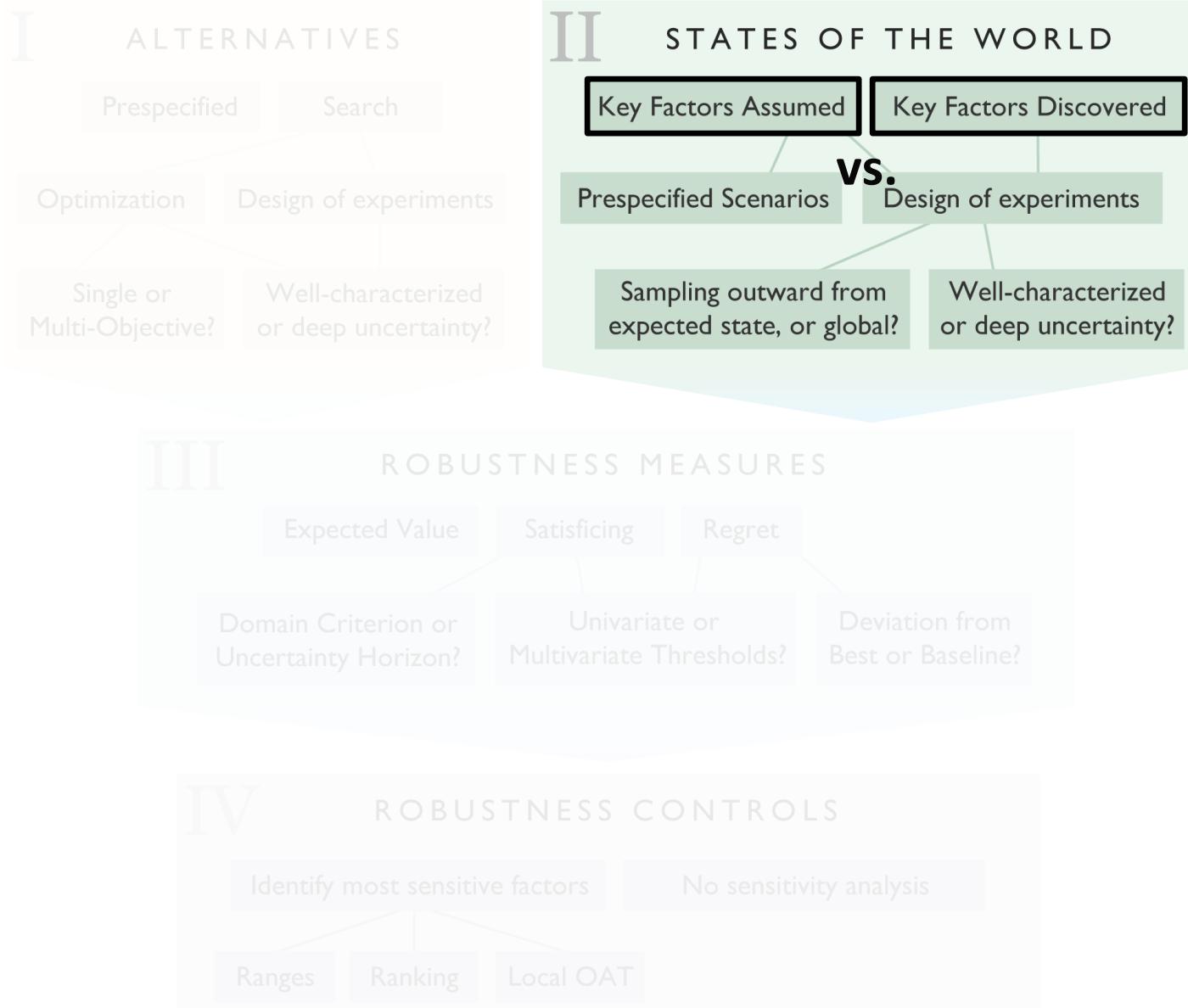
Which solutions are robust? How to decide?

Sample deeply uncertain states of the world  
(inflows, demand, etc.)

<http://www.hockscqc.com/articles/tunnelvision/tunnel-vision.jpg>



# Taxonomy of Robustness Frameworks



# Taxonomy of Robustness Frameworks



## III ROBUSTNESS MEASURES

Expected Value      Satisficing      Regret

Domain Criterion or Uncertainty Horizon?

Univariate or Multivariate Thresholds?

Deviation from Best or Baseline?

## IV ROBUSTNESS CONTROLS

Identify most sensitive factors

No sensitivity analysis

Ranges      Ranking      Local OAT





# Rhodium

## Robust Decision Making



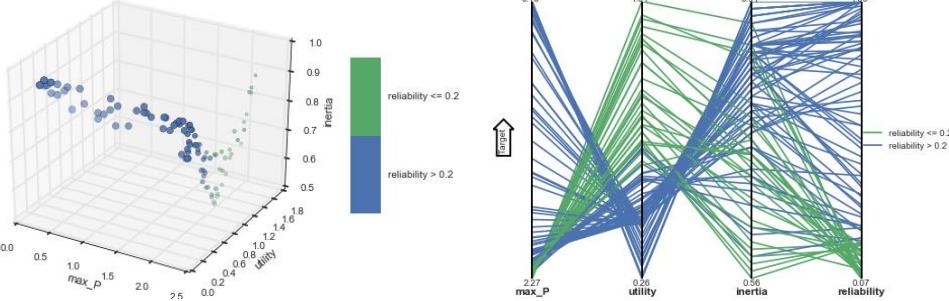
Released (Stable)

### Decision support framework

- Based on XLRM (Rand Corporation)
- Model-based, declarative design

Acts as the “glue” between your model and analysis codes

- Connects to models in C, C++, Fortran, Excel, R, Python, ...
- Integrates with Pandas, Numpy, Platypus, PRIM, SALib, Scipy, ...



```
model = Model(lake_problem)

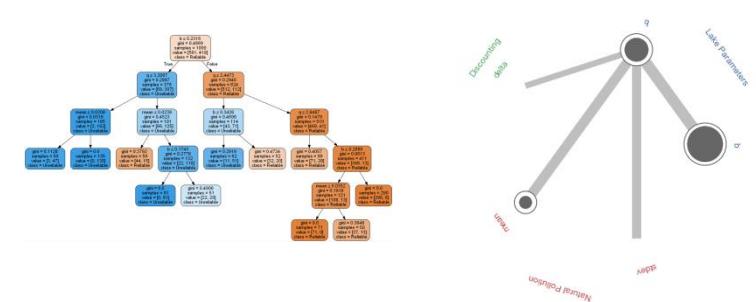
model.parameters = [Parameter("pollution_limit"),
Parameter("b"),
Parameter("q"),
Parameter("mean"),
Parameter("stdev"),
Parameter("delta")]

model.responses = [Response("max_P", MINIMIZE),
Response("utility", MAXIMIZE),
Response("inertia", MAXIMIZE),
Response("reliability", MAXIMIZE)]

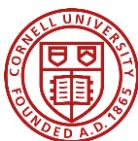
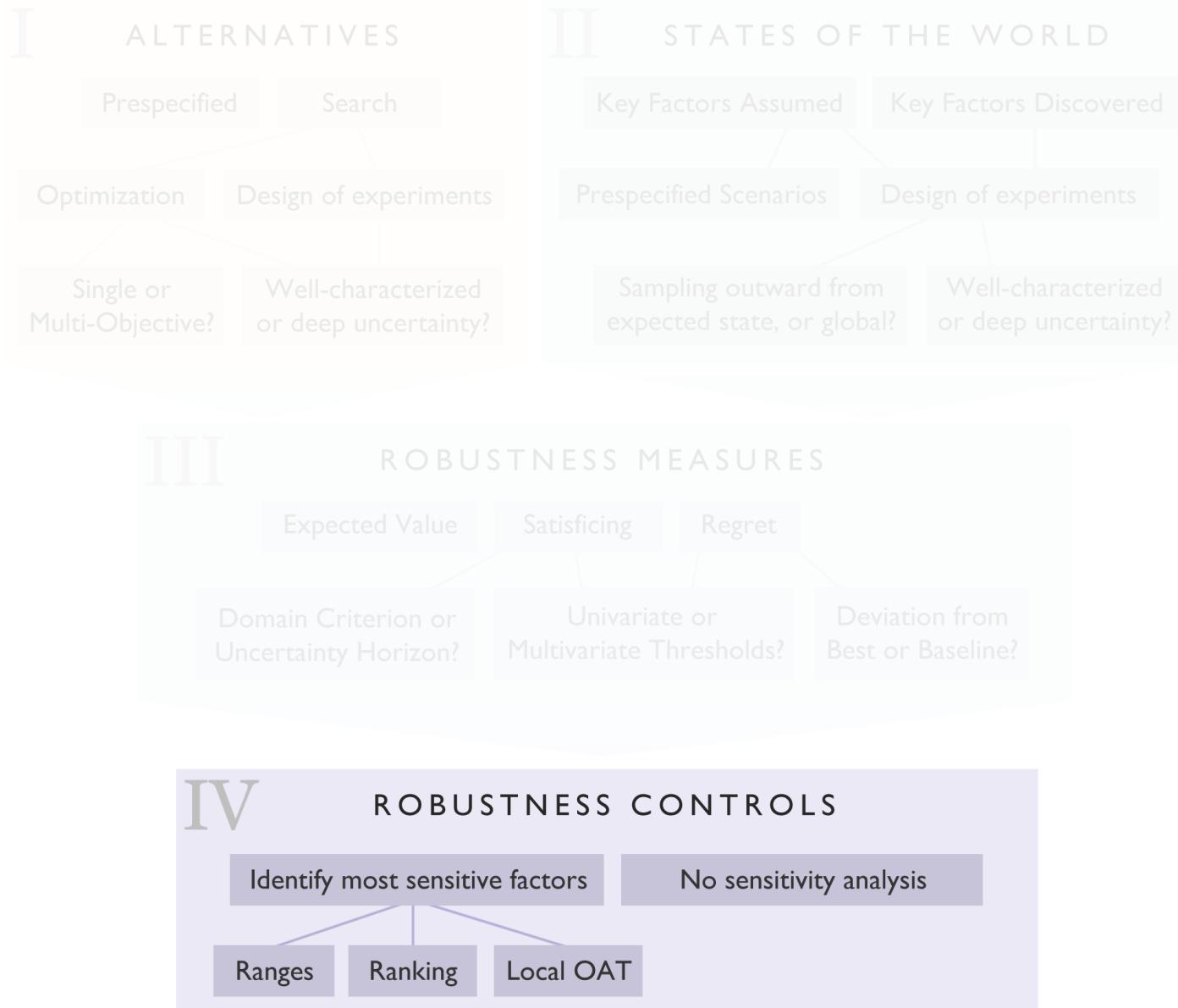
model.constraints = [Constraint(
"reliability >= 0.95 and utility >= 0.25")]

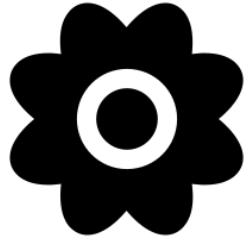
model.levers = [RealLever("pollution_limit", 0.0, 0.1, length=100)]
```

```
model.uncertainties = [UniformUncertainty("b", 0.1, 0.45),
UniformUncertainty("q", 2.0, 4.5),
UniformUncertainty("mean", 0.01, 0.05),
UniformUncertainty("stdev", 0.001, 0.005),
UniformUncertainty("delta", 0.93, 0.99)]
```



# Taxonomy of Robustness Frameworks





# PRIM

## Patient Rule Induction Method

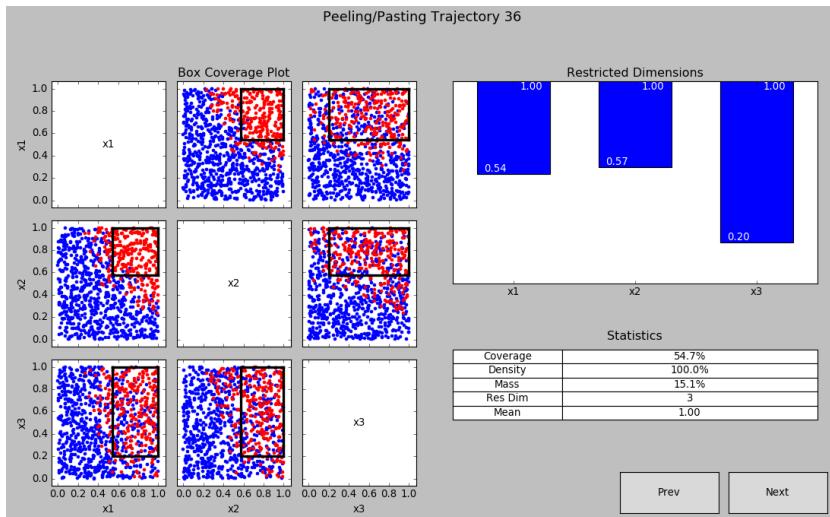
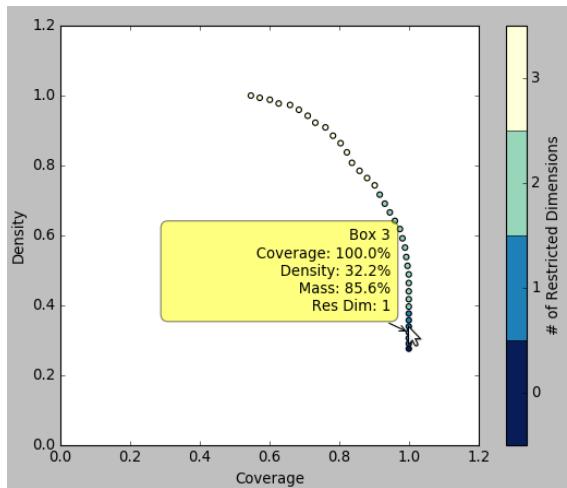


Released (Stable)

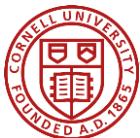
### For scenario discovery

- Identify regions, aka “boxes”, containing cases of interest
- Simple rules (min/max bounds)
- Run interactively using Matplotlib or share static figures in IPython Notebooks

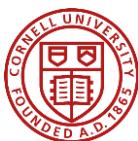
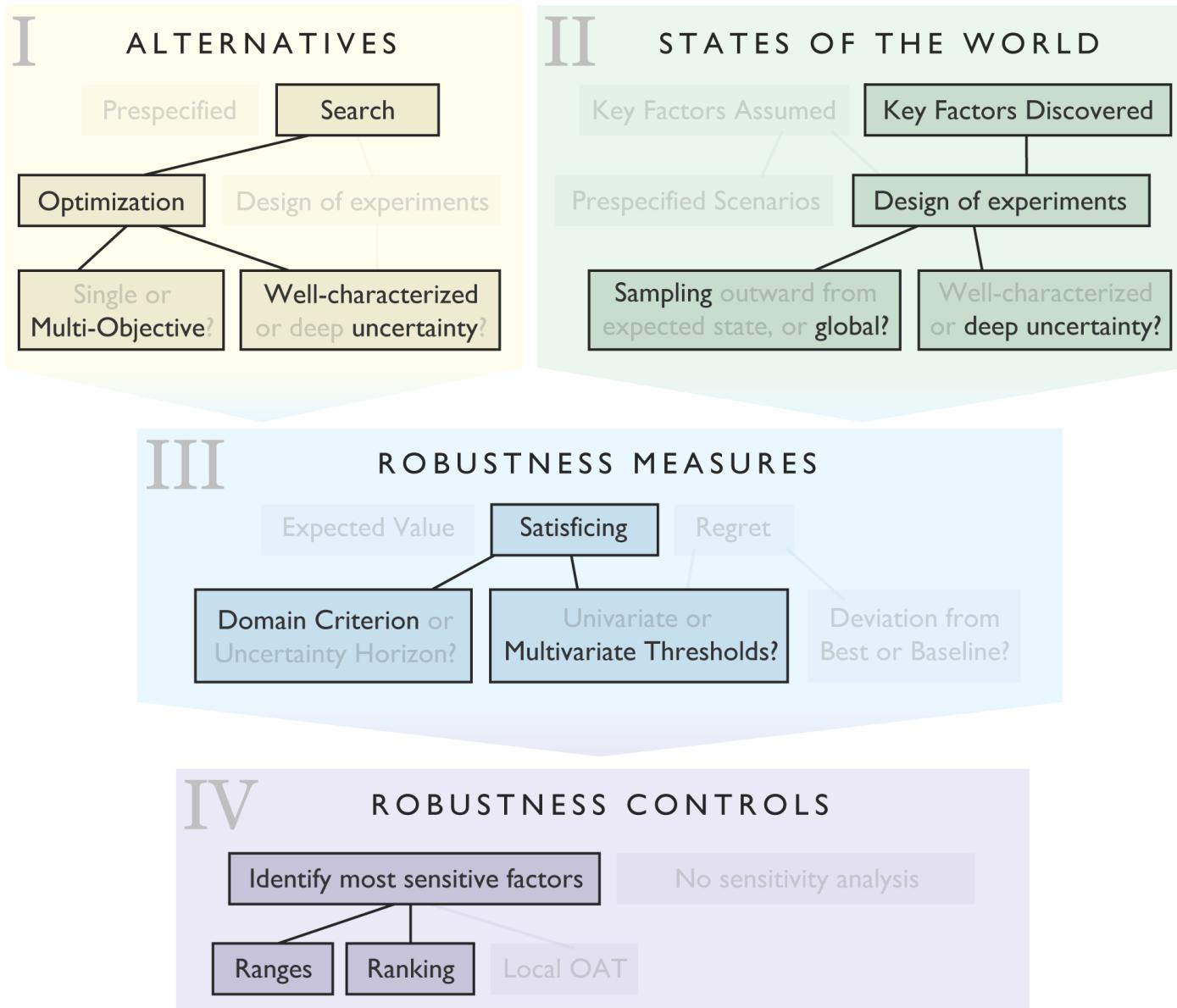
```
from prim import Prim  
  
p = Prim(df, response, threshold=0.5,  
          threshold_type=>")  
  
box = p.find_box()  
box.show_tradeoff()
```



<http://localhost:8890/notebooks/Desktop/Project-Platypus/Rhodium/Rhodium-DPS-Lake.ipynb#Robustness-Analysis>



# Many-Objective Robust Decision Making

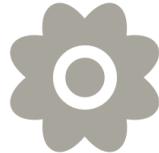




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