

# The MESSAGE<sub>ix</sub> modeling framework: Building a simple Energy System Model

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Material courtesy of Behnam Zakeri and Daniel Huppmann

NTNU course: Integrated Assessment Modelling (EP8900)



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# A tutorial to the MESSAGEix framework

## *Agenda*

- Introduction to MESSAGEix framework
- Review of installation
- MESSAGEix model and its structure
- Working with MESSAGEix tutorials (sample models)

# After this tutorial

## *The goal is to...*

- Learn about the main component of the MESSAGEix framework
- Be able find relevant information about MESSAGEix
- Be able to create a MESSAGEix scenario, solve and plot it using online tutorials
- Learn about some important methods for data handling and scenario analysis

## *Requirements*

- Knowledge on data analysis and programming

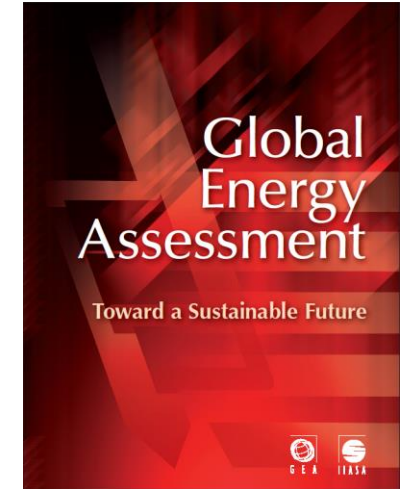


- Knowledge on energy systems
- Patience, motivation, and curiosity

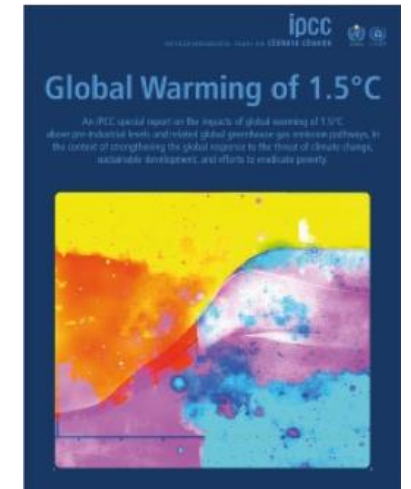
# The MESSAGE model at IIASA

## *IIASA and MESSAGE are at the center of global energy policy assessment*

- Since 1980s used for assessing sustainable development and energy/climate policies at regional and global scales  
(Manfred Strubegger, Sabine Messner and many others)
- MESSAGE a systems engineering, dynamic optimization model
- MESSAGE widely in use in other organizations like IAEA and member countries



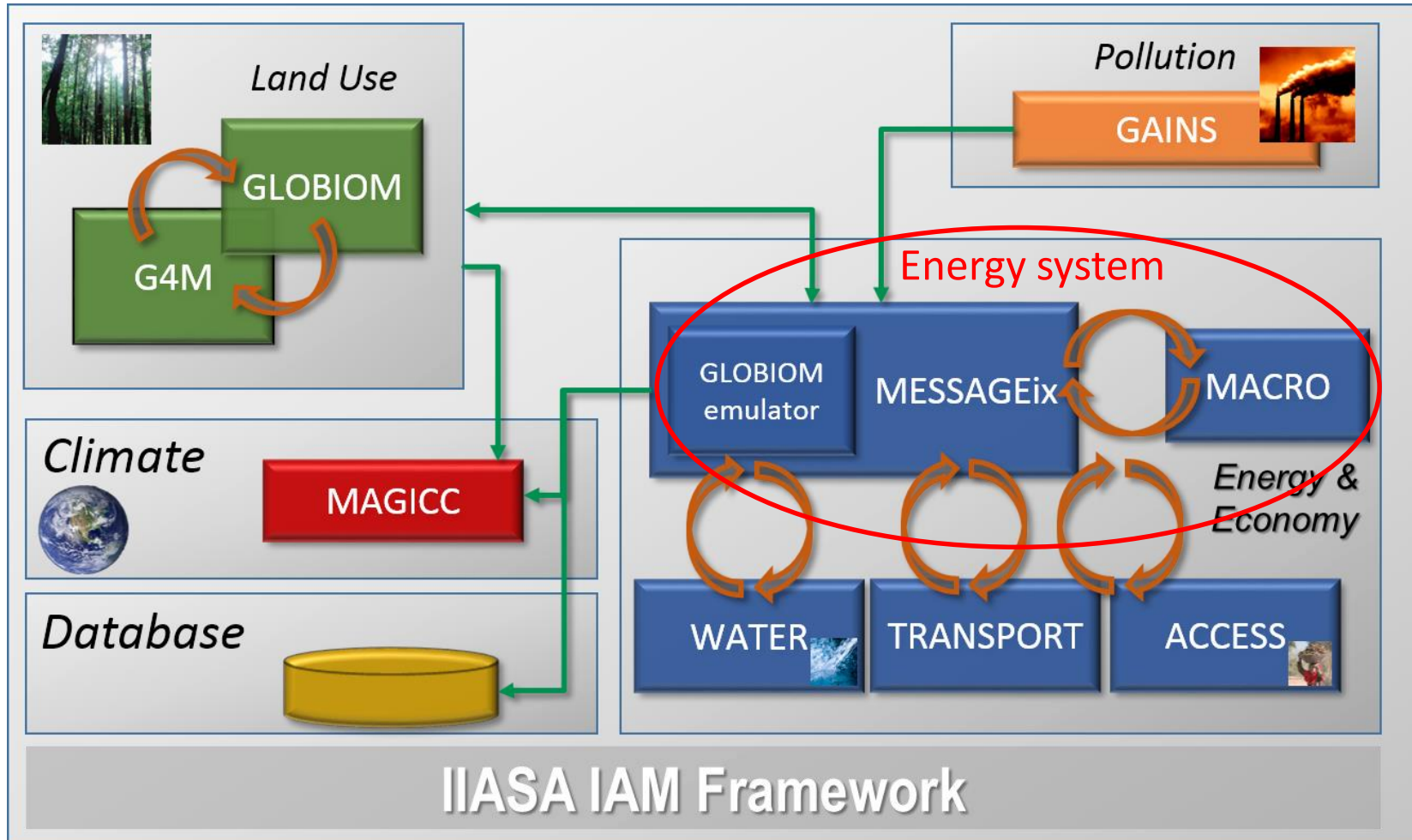
- Recent publications:
  - ⇒ *A low energy demand scenario for meeting the 1.5 °C target and sustainable development goals without negative emission technologies.* Grubler et al., Nature Energy (2018)
  - ⇒ *Energy investment needs for fulfilling the Paris Agreement and achieving the SDGs.* McCollum et al., Nature Energy (2018)



<http://www.ipcc.ch/report/sr15/>

# IIASA's Integrated Assessment Model (IAM)

*MESSAGEix is at the core*

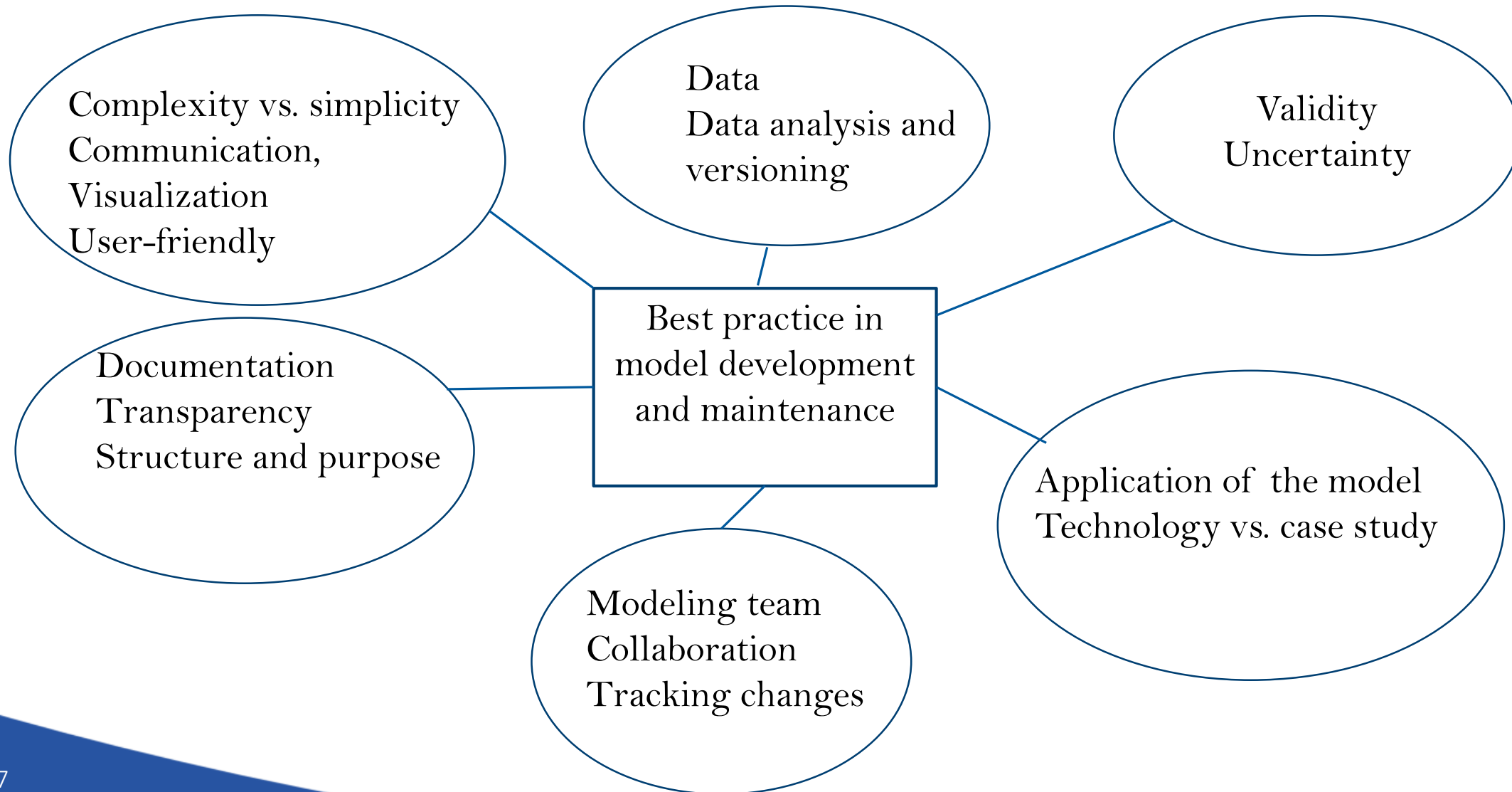


# Modeling and Model Development (2)

*Discussion in group: what do we expect from a good model?*

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*Discussion in group: what do we expect from a good model?*



# The MESSAGE<sub>ix</sub> framework: Goals and Vision

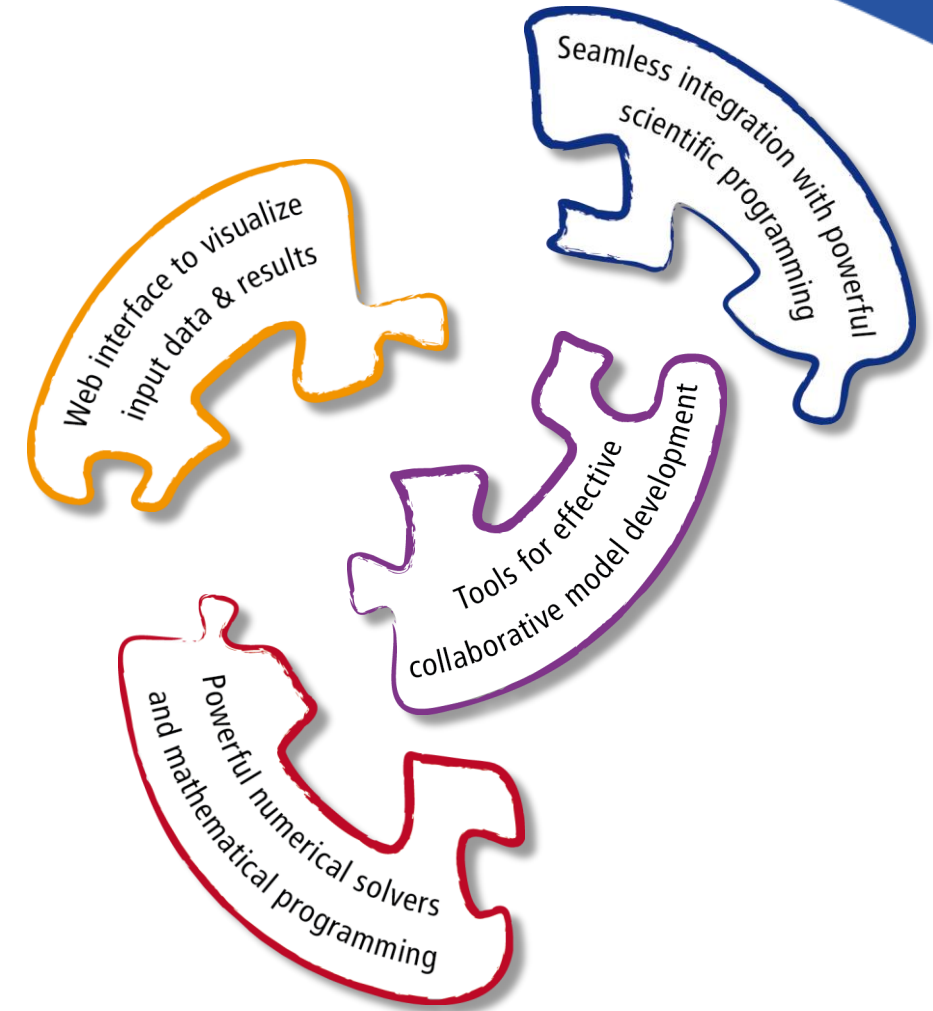
## *An integrated modeling platform for x-cutting analysis*

**Goal:** Developing a platform for streamlined modeling

- ⇒ using state-of-the-art tools for **data processing**,
- ⇒ building versatile & powerful **mathematical models**,
- ⇒ applying best practice of **collaborative research**

**Vision:**

- integration of models & scientific analysis between different disciplines
- across **spatial and temporal** levels of disaggregation
- highest level of transparency and scientific reproducibility for a wide audience

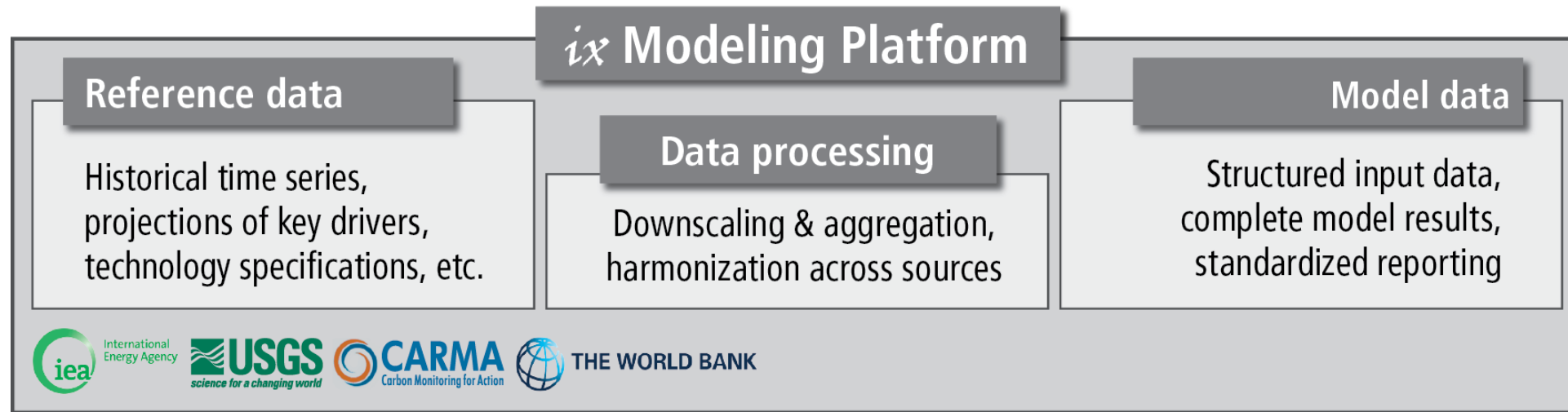


Key features of the *ix* modeling platform



# The MESSAGE<sub>ix</sub> framework: 1. Data management

*A central data management system (ixmp)*



Good data management is crucial for modeling & scientific analysis:

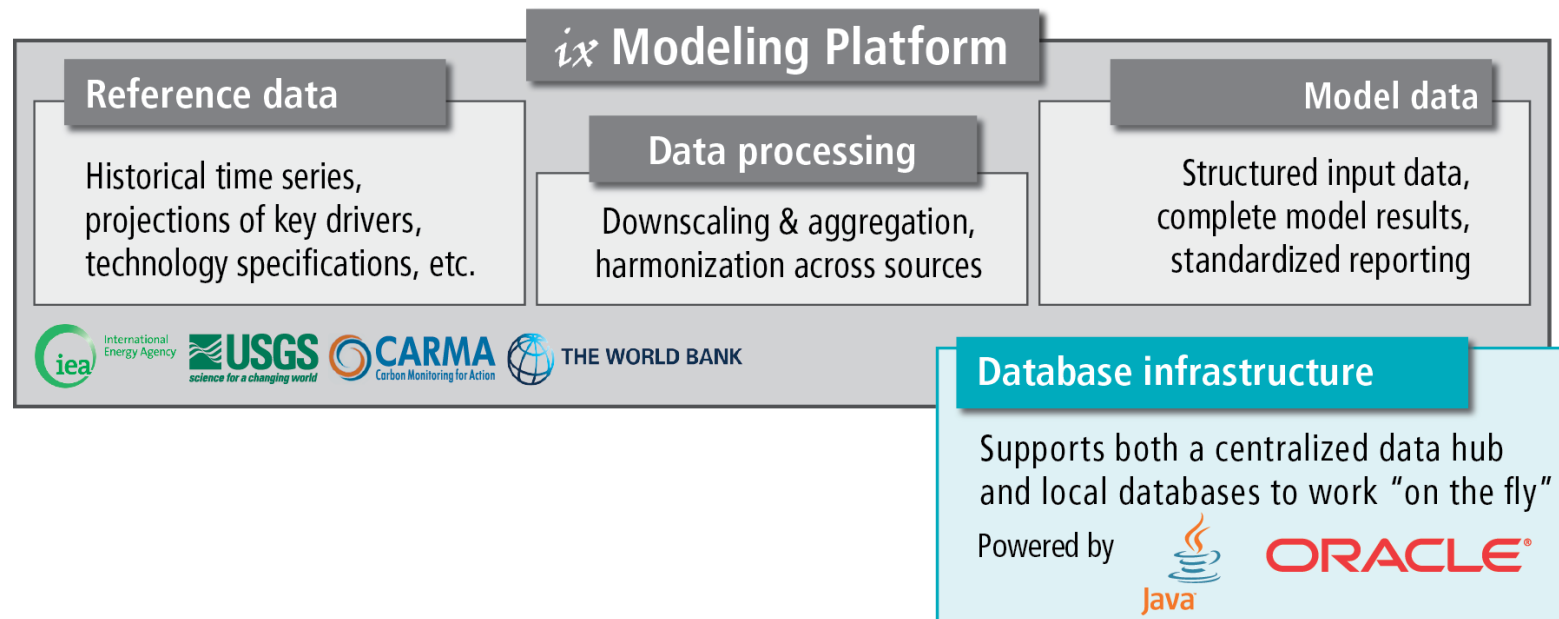
- ... version-controlled and traceable input data for model development
- ... reference data for calibration and verification
- ... efficient workflows based on standardized data processing tools and a common data interface

# The MESSAGE<sub>ix</sub> framework: 2. Database backend

## *Supported by a high-performance database architecture*

The platform...

- ... is based on a Java interface as gateway to the data
- ... supports both an **ORACLE database backend** for high-performance, collaborative modeling and **local, file-based databases** for getting started or working “on the fly”



# The MESSAGE<sub>ix</sub> framework: 3. Integration with GAMS

## *Connected to high-performance numerical programming*

The platform has an interface to GAMS, a versatile software for mathematical programming & optimization.

⇒ MESSAGE<sub>ix</sub> is the first model fully integrated with the *ix* modeling platform...

### Suite of mathematical models

MESSAGE<sub>ix</sub> & MACRO

Versatile spatial systems-economic model

- ✓ Perfect-foresight or recursive-dynamic approach
- ✓ Easy to add new features & extensions
- ✓ Flexible spatial & temporal detail



G A M S

### Water–land integration

# The MESSAGE<sub>ix</sub> framework: Documentation

## Implementing tools for comprehensive documentation

The framework ensures transparency and intelligibility through “auto-documentation” of all codes & packages on [readthedocs.org](http://readthedocs.org)

- ⇒ Documentation of all scientific programming packages using ‘sphinx’
- ⇒ Documentation of the mathematical equations generated automatically from  $\text{L}^{\text{A}}\text{T}_{\text{E}}\text{X}$  mark-up in the GAMS code


 **Read the Docs**

```

***
* Technology section
* -----
*
* Technical and engineering constraints
* ~~~~~
*
* Equation CAPACITY_CONSTRAINT
* ~~~~~
* This constraint ensures that the actual activity of a technology at a node/time cannot exceed available (maintained)
* capacity summed over all vintages, including the technology capacity factor :math:`capacity\_factor_{n,t,y^V,y}`.
*
* .. math::
* \sum_m ACT_{n,t,y^V,y,m,h}
* \leq duration^H_{n,t,y^V,y,h} \cdot capacity\_factor_{n,t,y^V,y,h} \cdot CAP_{n,t,y^V,y}
* \quad t \in T^{INV}
*
* where :math:`T^{INV}` is the set of all technologies
* for which investment decisions and capacity constraints are relevant.
***
CAPACITY_CONSTRAINT(node,inv_tec,vintage,year,time)$( map_tec_time(node,inv_tec,year,time)
AND map_tec_lifetime(node,inv_tec,vintage,year) )..
sum(mode$( map_tec_act(node,inv_tec,year,mode,time) ), ACT(node,inv_tec,vintage,year,mode,time) )
=L= duration_time(time) * capacity_factor(node,inv_tec,vintage,year,time) * CAP(node,inv_tec,vintage,year) ;

```




International Institute for  
Applied Systems Analysis  
www.iiasa.ac.at  
master

Search docs

Installation  
Tutorials  
MESSAGEix framework overview  
Python & R API

Mathematical specification

- Sets and mappings definition
- Parameter definition
- Mathematical formulation (core model)
  - Notation declaration
  - Objective function
  - Regional system cost accounting function
  - Resource and commodity section
- Technology section
  - Technical and engineering constraints
  - Constraints representing renewable integration
  - Constraints for add-on

Read the Docs
v: master

### Equation STOCKS\_BALANCE

This constraint ensures the inter-temporal balance of commodity stocks. The parameter  $commodity\_stocks_{n,c,l}$  can be used to model exogenous additions to the stock

$$STOCK_{n,c,l,y} + commodity\_stock_{n,c,l} = duration\_period_y \cdot \sum_h STOCK\_CHG_{n,c,l,y,h} + STOCK_{n,c,l,y+1}$$

### Technology section

#### Technical and engineering constraints

The first set of constraints concern technologies that have explicit investment decisions and where installed/maintained capacity is relevant for operational decisions. The set where  $T^{INV} \subseteq T$  is the set of all these technologies.

### Equation CAPACITY\_CONSTRAINT

This constraint ensures that the actual activity of a technology at a node cannot exceed available (maintained) capacity summed over all vintages, including the technology capacity factor  $capacity\_factor_{n,t,y^V,y}$ .

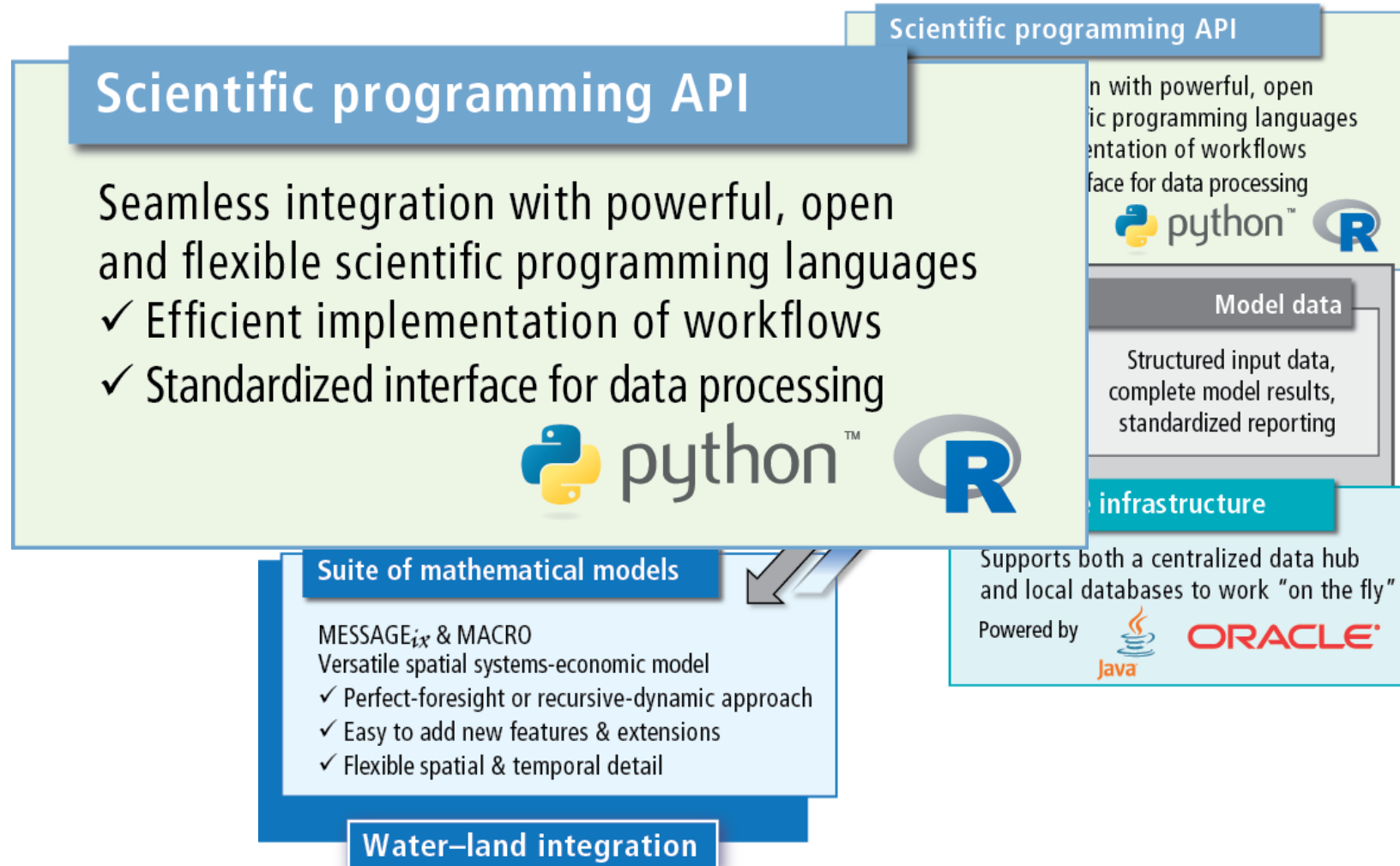
$$\sum_m ACT_{n,t,y^V,y,m,h} \leq duration\_time_h \cdot capacity\_factor_{n,t,y^V,y,h} \cdot CAP_{n,t,y^V,y} \quad \forall t \in T^{INV}$$

### Equation CAPACITY\_MAINTENANCE\_HIST

The following three constraints implement technology capacity maintenance over time to allow early retirement. The optimization problem determines the optimal timing of retirement, when fixed operation-and-maintenance costs exceed the benefit in the objective function.

# The MESSAGE<sub>ix</sub> framework : 4. Scientific programming

## *Interfaces to scientific programming for advanced users*



# The MESSAGEix framework: 5. Collaborative research

*Geared towards best-practice in collaborative research*

The platform facilitates collaborative model development

... through comprehensive version control of data, model codes and scripts

... implementing “continuous integration”

⇒ automated unit-testing of new features  
to ensure stable code base

[https://github.com/iiasa/message\\_ix](https://github.com/iiasa/message_ix)

- Google Group (questions and answers):

[https://groups.google.com/forum/#!forum/message\\_ix](https://groups.google.com/forum/#!forum/message_ix)



# The MESSAGE<sub>ix</sub> framework: 6. Interactive web user interface

*An intuitive gateway to modeling data for researchers and a wider audience*



## Web-based user interface

### Features

- ✓ Visualization of input data & model results
- ✓ Intuitive drag & drop tables and graphs
- ✓ Data import & export using MS Excel



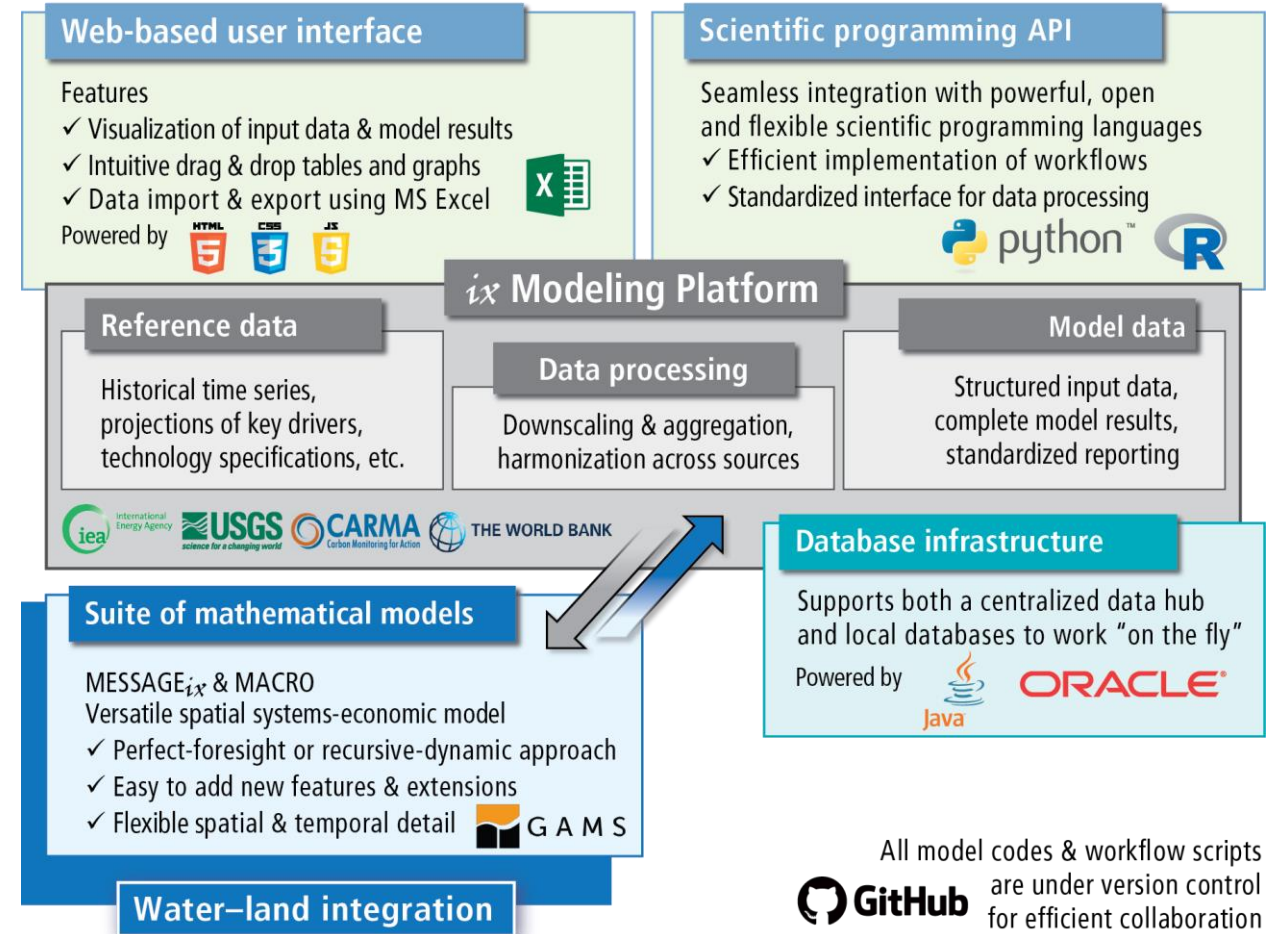
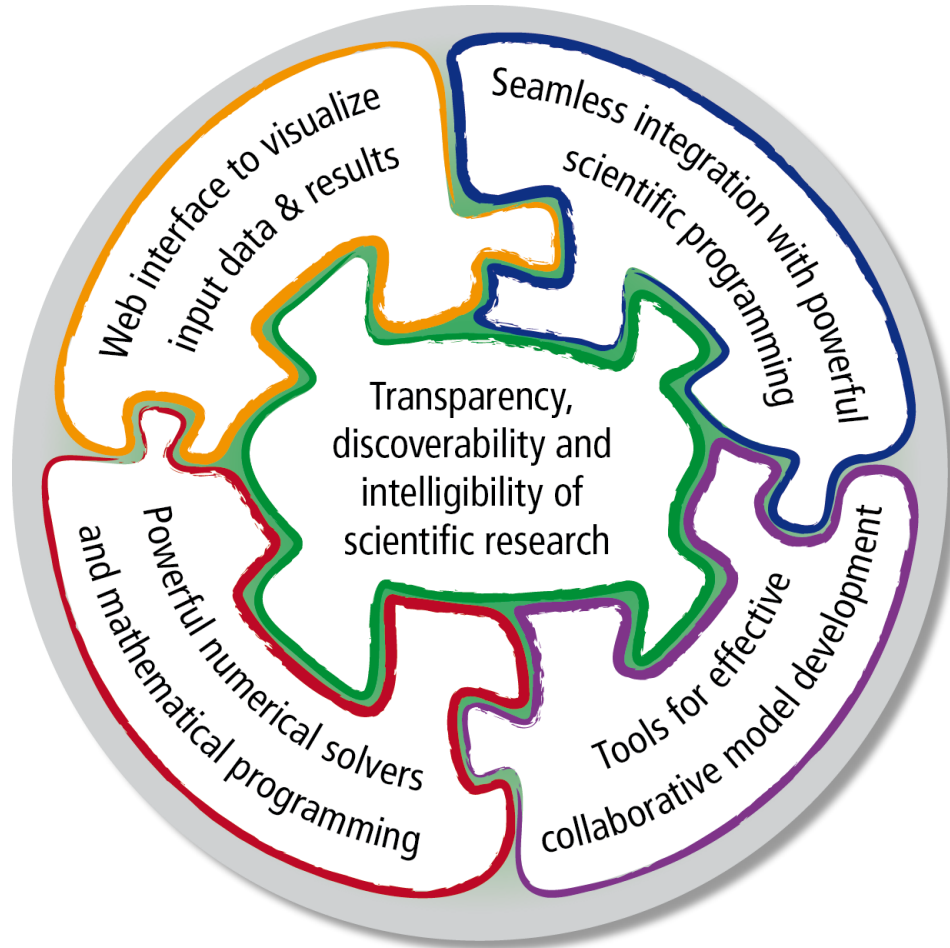
Powered by






# The MESSAGE<sub>ix</sub> framework

*Facilitating transparency and reproducibility of research*



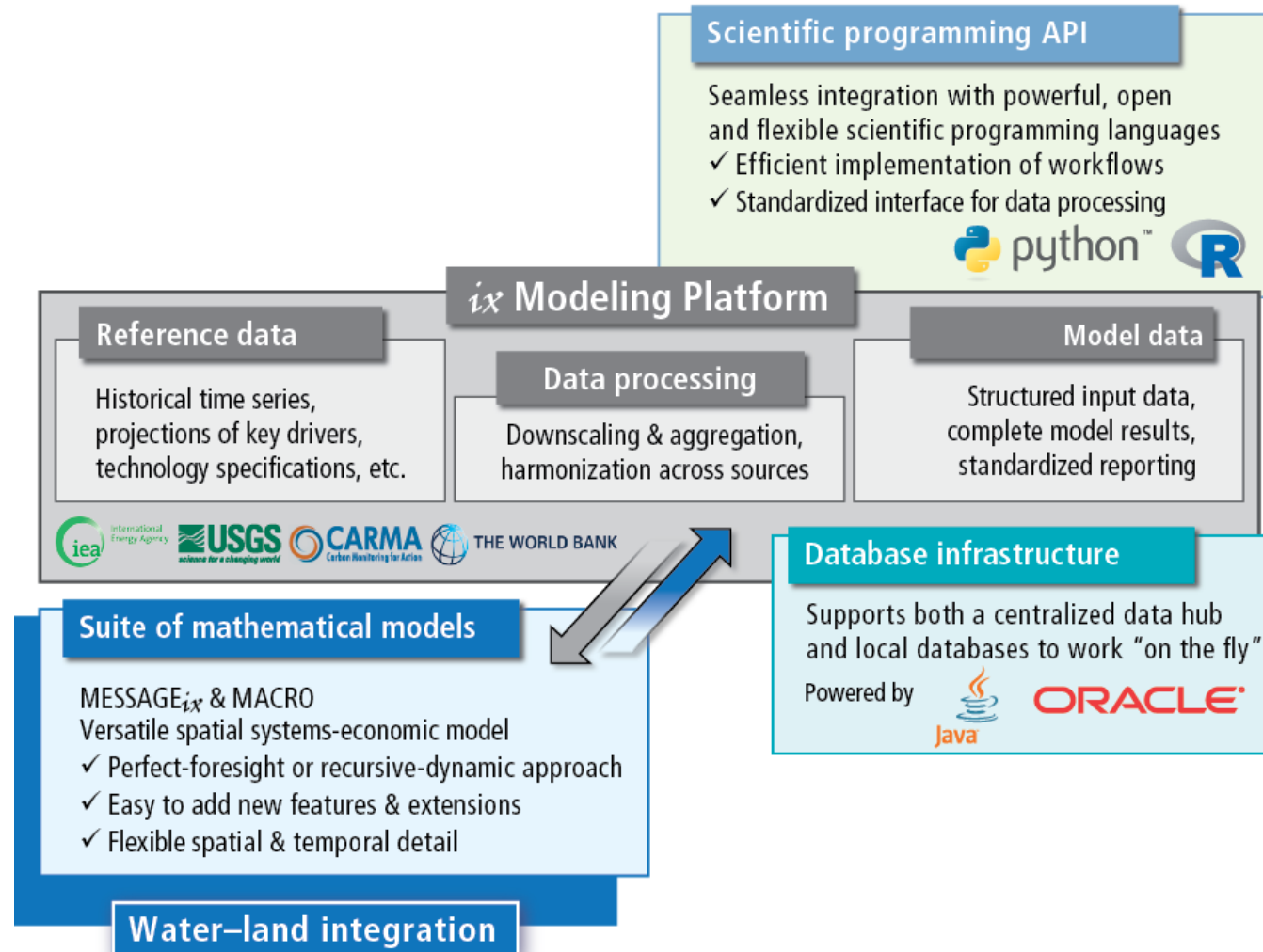
All model codes & workflow scripts are under version control for efficient collaboration

 **GitHub**



# The MESSAGE<sub>ix</sub> framework : Workflow of modeling

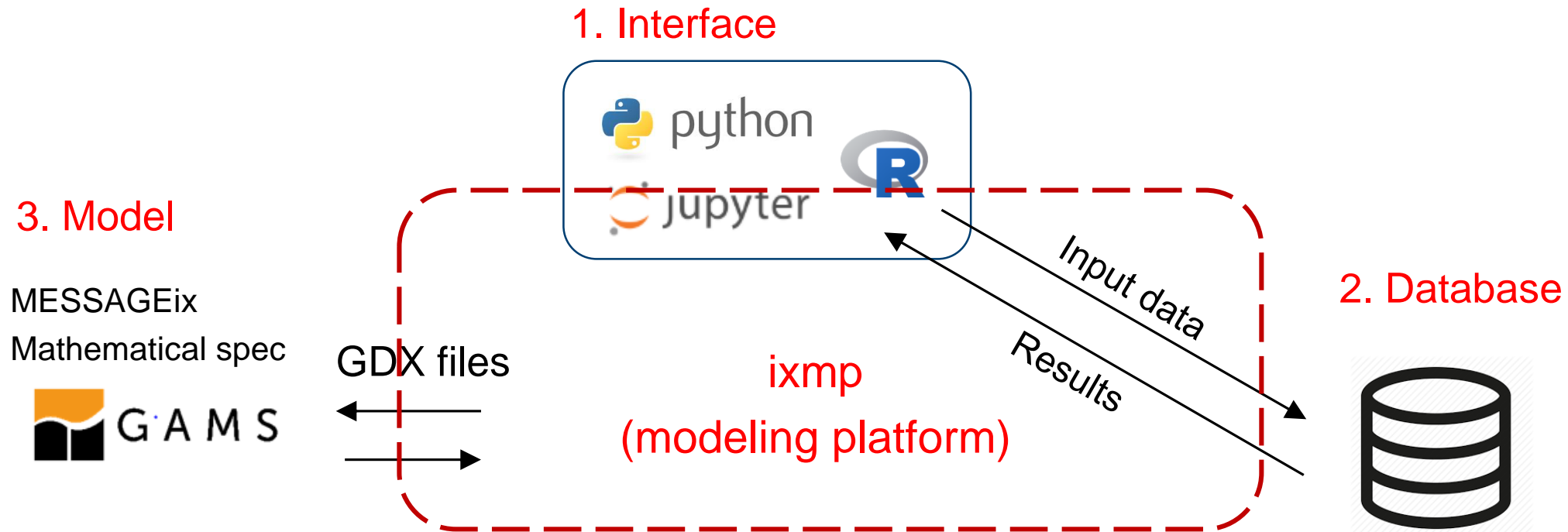
*Flexible and high performance processes*



# The MESSAGE<sub>ix</sub> framework : Workflow of modeling

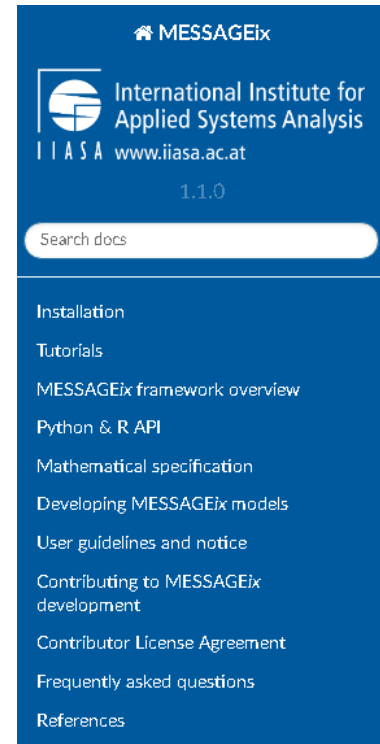
## *Flexible and high performance processes*

- Interface a **central place** for creating, loading, or working with a scenario
- Data can be modified through the interface or other input files (e.g., Excel)
- To see model data and results: load from database, model GDX files, etc.



# MESSAGEix Website: main source of information

- Main page:  
⇒ <https://MESSAGE.iiasa.ac.at>
- Open-source GitHub repository:  
⇒ [https://github.com/iiasa/message\\_ix](https://github.com/iiasa/message_ix)  
(contribution guide)
- Tutorials and examples



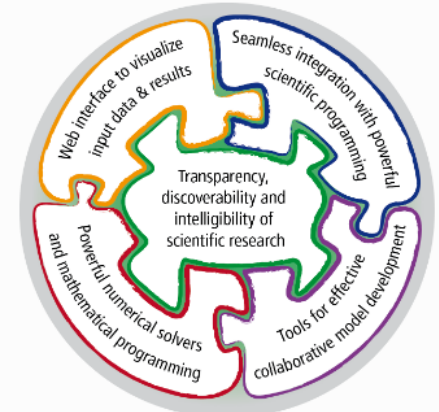
[Docs](#) » The MESSAGEix framework

[View page source](#)

## The MESSAGEix framework

### Overview and scope

MESSAGEix is a versatile, open-source, dynamic systems-optimization modelling framework. It was developed for strategic energy planning and integrated assessment of energy-engineering-economy-environment systems (E4). The framework can be applied to analyse scenarios of the energy system transformation under technical-engineering constraints and political-societal considerations. The optimization model can be linked to the general-economy MACRO model to incorporate feedback between prices and demand levels for energy and commodities. The equations are implemented in the mathematical programming system **GAMS** for numerical solution of a model instance.



The ix modeling platform (source: [1])

# The MESSAGEix framework: Installation

## *Two types of installation*

### 1. Install MESSAGEix through Anaconda

- You only want to use the public release (latest version)
- You don't aim to contribute to the code on Github
- You will be still able to develop your features to your code

### 2. Install through the source (advanced users, developers)

- You want to test and review the latest features (i.e., the ones after the latest public release)
- You want to contribute to the code
- You know about the collaborative code development

# The MESSAGEix framework: Installation (2)

## *A checklist*

### 1. Install the required software

- Anaconda (set as PATH environment variable)
- GAMS (set as PATH environment variable)



### 2. Install MESSAGEix

- Open Anaconda Prompt window, and type:  
`$conda install -c conda-forge message-ix`

### 3. Download Tutorials (examples for learning the model)

- In Anaconda Prompt window type:  
`$messageix-dl --local_path "C:\Users\yourname\myfiles\MESSAGEix"`  
*(In case of path permission or access error, still Tutorials might have been downloaded)*

# The MESSAGEix framework: After installation

## *What is where?*

### 1. ixmp and message\_ix python packages

- Locate your Anaconda (python) library and navigate to *site-packages*
  - You can open windows command line and type:  
`$where Anaconda`
  - Then, navigate to *site-packages* (C:\...\Anaconda3\Lib\site-packages)
- You should be able to see two packages *ixmp* and *message\_ix*

### 2. Mathematical model folder

- Model folder is by default under *messgae\_ix* folder
- Model folder can be changed to a new folder (optional)

Open Conda command window, and type:

```
$messageix-config --model_path /path/to/model
```

# The MESSAGEix framework: Mathematical formulation

*Everything is at your disposal!*

## 1. Looking into the GAMS files

- Locate your “model” folder (for example, C:\...\message\_ix\message\_ix\model)
- Create a GAMS project there (optional)
- MESSAGE formulation in (C:\...\model\MESSAGE): for example look at **model\_core.gms**
- Input data in (C:\...\model\data): GDX files
- Output results in (C:\...\model\output): GDX files

# Linear programming (LP) (reminder)

## *Applications of LP*

- Production management
- Personnel management
- Marketing management
- Resource/ inventory management
- Blending problem, etc

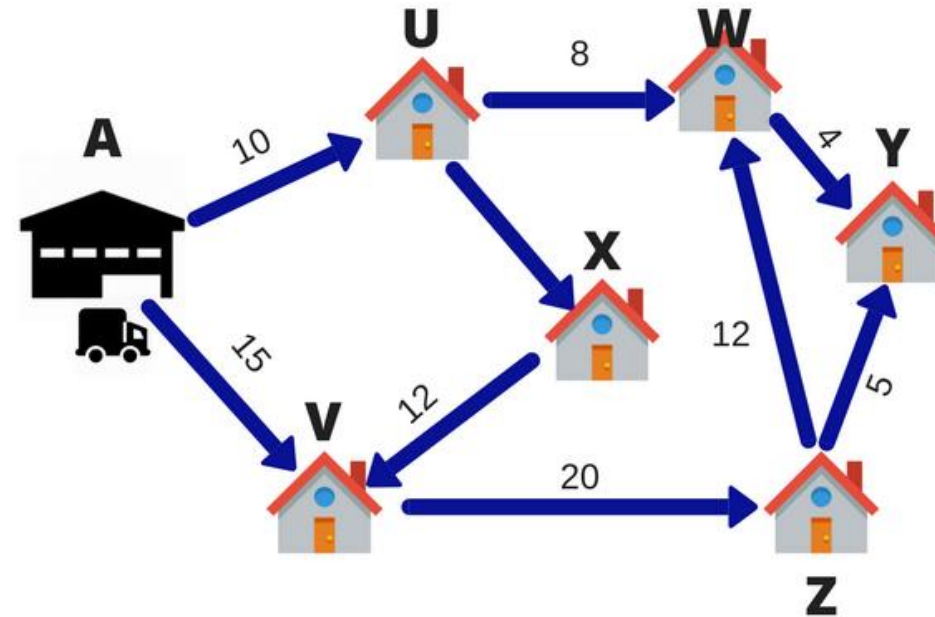


image: deepai.org

## *Principle:*

Maximizing the utility (use of resources)

Or Minimizing the cost of meeting a service → MESSAGEix



# MESSAGEix: a linear optimization model

## *Minimizing cost of the system*

- **Objective:** The least cost option for meeting certain services (demand)
- **System:** a set of technologies (processes), resources, and products
- **Cost of the system:** installing/maintaining **capacity**, cost of **activity** (operation), and emissions, land use and relation costs (if any)
- **Constraints:** maximum use of a technology, growth/decline rates of activity, capacity factor, etc.

## *A note on “capacity” and “activity” (MESSAGEix formulation)*

- **Capacity:** installed units of a technology (e.g. three cars)
- **Activity:** operation of that technology (e.g., 3 h usage of each car per day)
- **Reminder:** capacity  $\neq$  activity

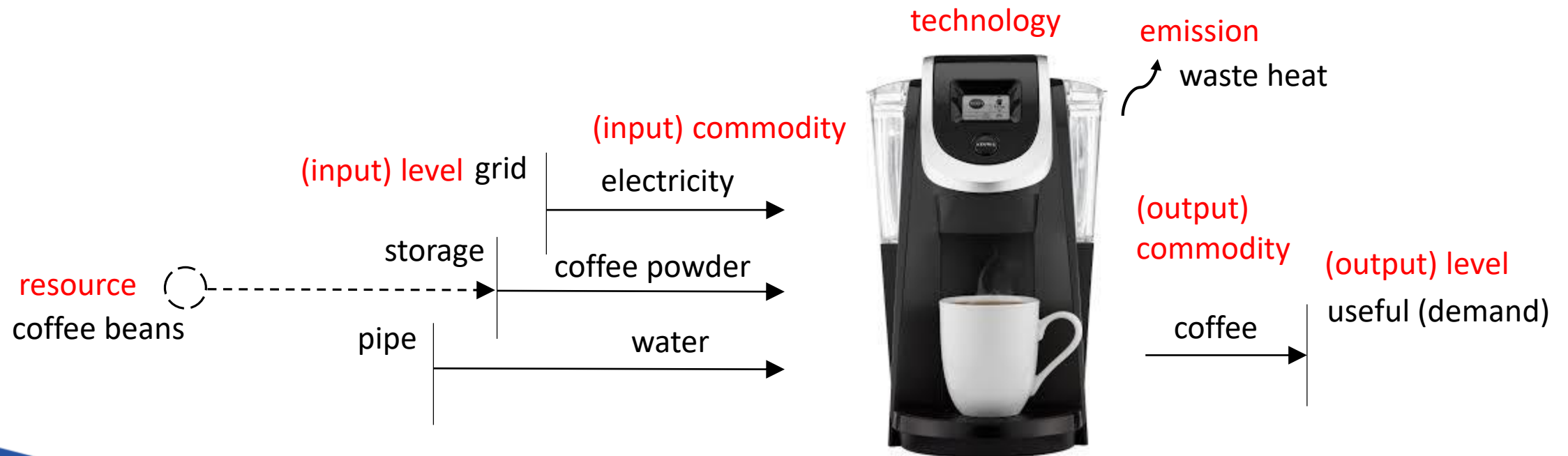


# MESSAGEix: a technology-based model

## *Technologies and resources meet demand*

- Example **technologies**: electric car, reactor, pipeline, power plant, building, ship, industrial process

## *A sample technology: coffee machine*



# MESSAGEix: Sets and Parameters

## Sets:

- List of elements for building a model
- Example: technology, commodity, level, node, etc.

CONSTRUCTION MATERIALS		
Part	Cast Iron Pump	Stainless Steel Pump
Inlet / Motor Bracket	Cast Iron	Cast 316 SS
Discharge Housing	Steel	316 SS
Pump Housing	304 SS Tubing	316 SS Tubing
Impellers	Noryl	Noryl
Diffusers	Noryl	Noryl
Wear Rings	316 SS	316 SS
Shaft & Coupling	316 SS / 416 SS	316 SS
Shaft Bearing Sleeve	316 SS	316 SS
Shaft Bearing	Bronze	Rulon
Mechanical Seal	Carbon/Ceramic	Carbon/Ceramic
Mechanical Seal Spacer	302 SS, Buna N	316 SS, Viton
O-Rings	416 SS	316 SS
	Buna-N	Viton

## Parameters:

- Adding information about sets
- Defining quantities (specification)
- Relating sets to each other, etc.



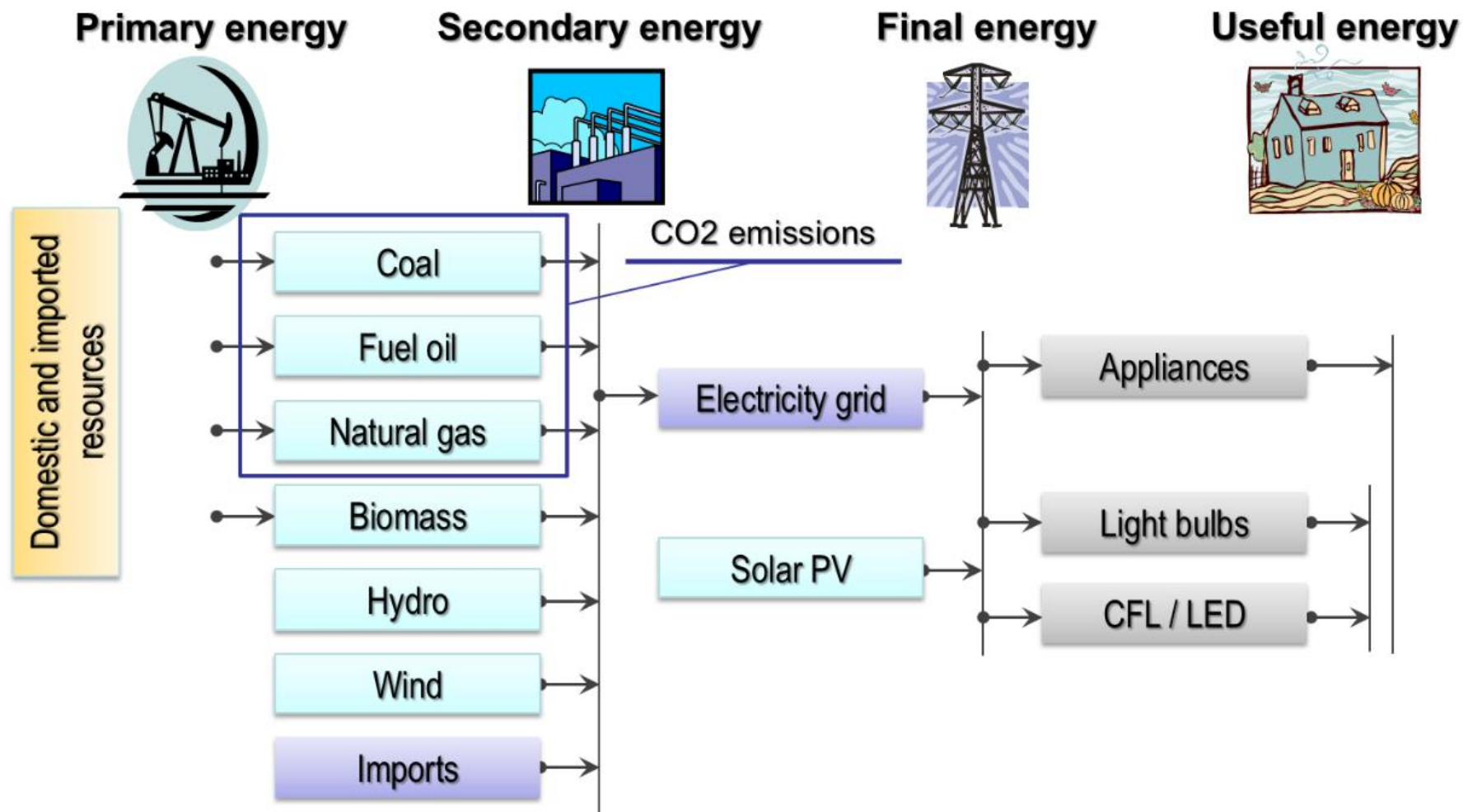
## Equations:

- Relationship between sets, parameters, **variables**, etc.
- Building the model



# MESSAGEix: Energy system

*Technologies, commodities, levels, etc*



- Locate your tutorial folder in your machine
- Then, open a command window and call *jupyter notebook*
- Navigate to the folder for Westeros tutorials and open the baseline

This tutorial is based on the country of Westeros from the TV show "Game of Thrones".



Select items to perform actions on them.

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# Westeros baseline

## *Different steps of modeling*

- Creating a new scenario (or loading an existing one)
- Declaring required sets (*node, technology, commodity, level*, etc.)
- Defining required parameters (adding numeric data, relating sets to each other, etc.)
  - *demand*
  - *techno-economic parameters*
  - *bounds and dynamic constraints*
- Solving the model
- Postprocessing and plotting

# Working with MESSAGEix scenarios

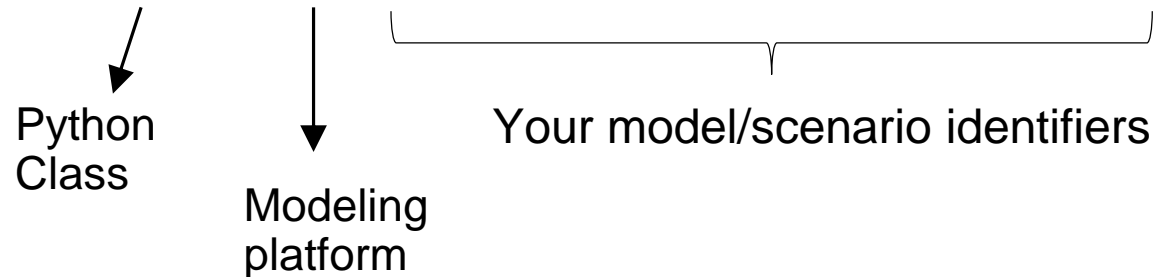
## *A short note on model/scenarios*

- Loading the ixmp platform (connection to the database):

```
mp = ixmp.Platform(dbtype='HSQLDB')
```

- Creating a new scenario:

```
my_scen = message_ix.Scenario(mp, model, scenario, version='new')
```



Example: `model = 'building energy system', scenario = 'baseline' (or 'low efficiency')`

- Loading an existing scenario:

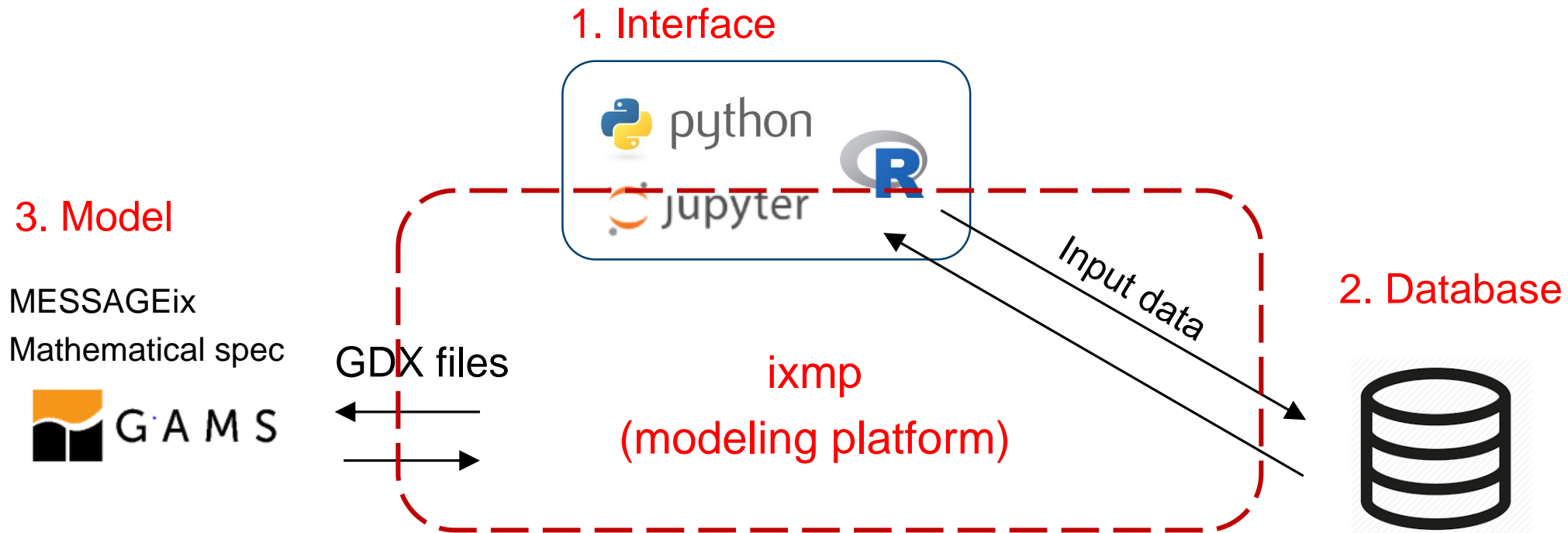
```
my_scen = message_ix.Scenario(mp, model, scenario, version=1)
```

```
my_scen = message_ix.Scenario(mp, model, scenario)
```

# The MESSAGE<sub>ix</sub> framework : Workflow of modeling

## Reminder

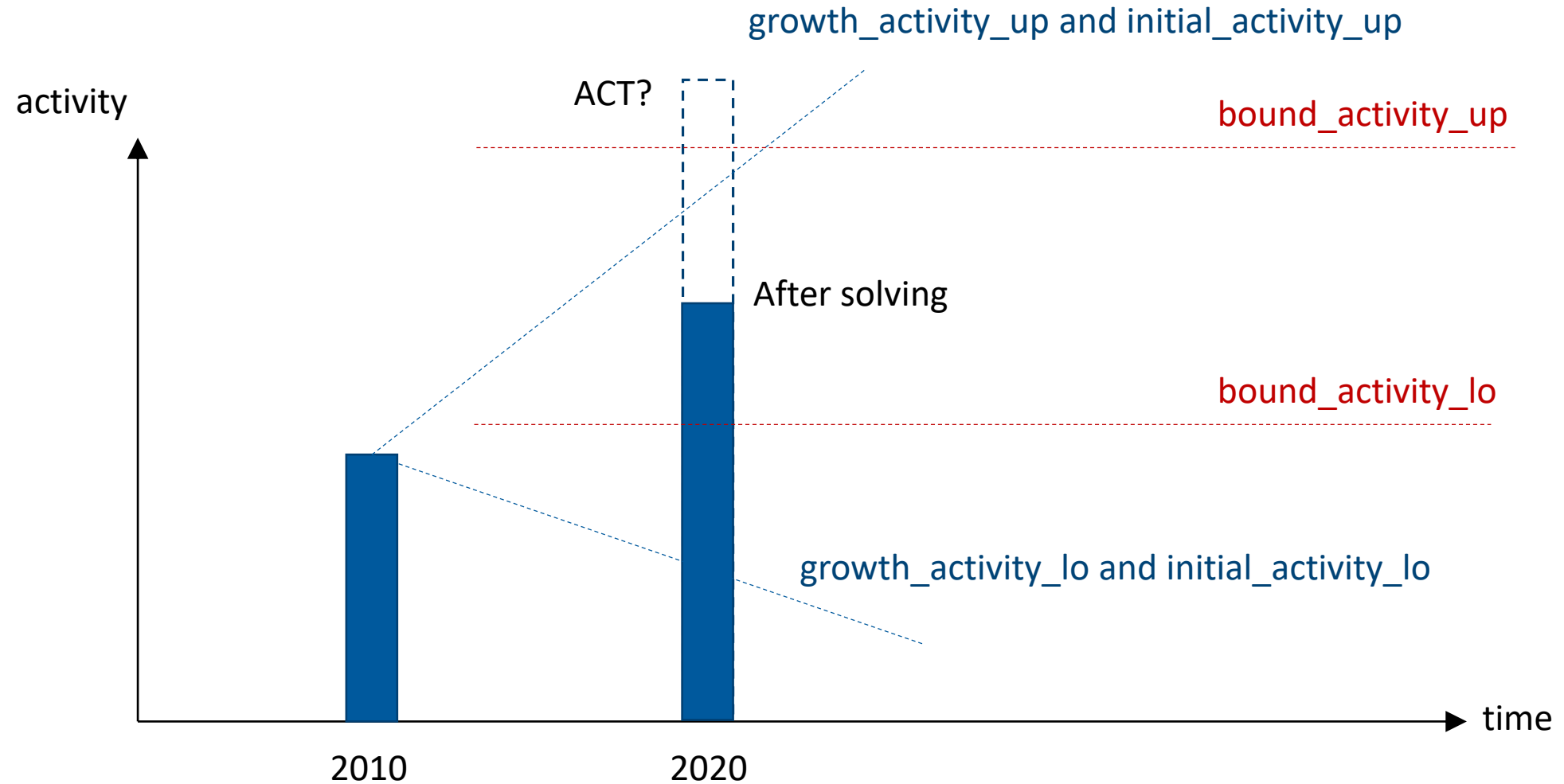
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- Model data and results: loaded from database, model GDX files, etc.





# Dynamic constraints

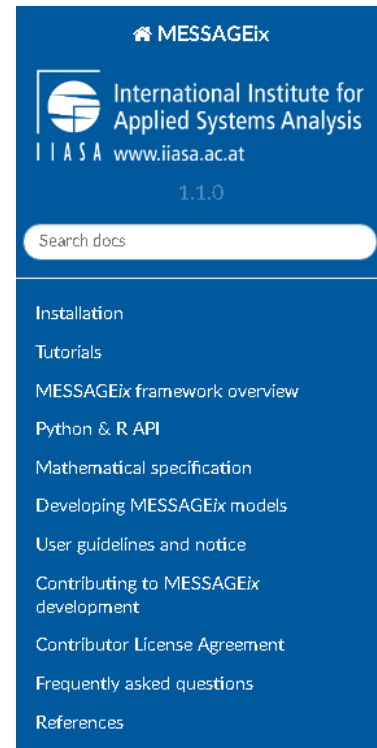
*Controlling behavior of technologies over time*



[Link to the documentation](#)

# More information

- Main page:  
⇒ <https://MESSAGEix.iiasa.ac.at>
- Open-source GitHub repository:  
⇒ [https://github.com/iiasa/message\\_ix](https://github.com/iiasa/message_ix)  
(contribution guide)
- Tutorials and examples



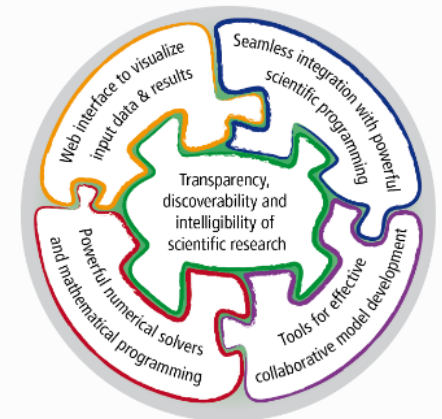
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The ix modeling platform (source: [1])

- Scientific reference to the MESSAGEix framework:  
Huppmann et al. (2019). *The MESSAGEix Integrated Assessment Model and the ix modeling platform: An open framework for integrated and cross-cutting analysis of energy, climate, the environment, and sustainable development*. Environmental Modelling & Software 112: 143-156. DOI: [10.1016/j.envsoft.2018.11.012](https://doi.org/10.1016/j.envsoft.2018.11.012)

*Thank you very much for your attention!*

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