



# **MEXPLORER 1.0.0-rc.0 – A mechanism explorer for analysis and visualization of chemical reaction pathways based on graph theory**

Rolf Sander

Air Chemistry Department, Max-Planck Institute of Chemistry, P.O. Box 3060, 55020 Mainz, Germany **Correspondence:** R. Sander (rolf.sander@mpic.de)

Abstract. The open-source software MEXPLORER 1.0.0-rc.0<sup>1</sup> is presented here. The program can be used to analyze, reduce, and visualize complex chemical reaction mechanisms. The mathematics behind the tool is based on graph theory: chemical species are represented as vertices, and reactions as edges. MEXPLORER is a community model published under the GNU General Public License.

### 5 1 Introduction

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When research in atmospheric chemistry started about a century ago, only a couple of reactions were known. For example, Chapman (1930) identified the most important reactions explaining the stratospheric ozone layer:

(R1)

$$O_2 + O \rightarrow O_3$$
 (R2)

$$O_2 \xrightarrow{h\nu} 2O$$
 (R3)

$$O_3 \quad \stackrel{h\nu}{\to} \quad O_2 + O \tag{R4}$$

Since then, numerous additional chemicals have been discovered in the atmosphere, and our knowledge about their reactions has grown immensely. Today, many models are available to describe the atmospheric degradation of organics in the gas and the aqueous phase, e.g., the Mainz Organic Mechanism (MOM, Sander et al., 2019) and the Jülich Aqueous-phase Mechanism

15 of Organic Chemistry (JAMOC, Rosanka et al., 2021). The most comprehensive set of reactions for tropospheric organic compounds is the Master Chemical Mechanism (MCM), which contains more than 15 000 reactions<sup>2</sup>.

Several methods have been developed to reduce the complexity of such large mechanisms. The approach to combine chemical species manually into families has been used for a long time (Crutzen and Schmailzl, 1983). Newer approaches include the Common Representative Intermediates (CRI) by Watson et al. (2008) and the skeletal mechanism reduction (Tomlin and Turányi, 2013). Such automatized methods produce smaller mechanisms which can increase the speed of numerical simula-

tions. However, when used as a black box, they do not contribute to our understanding of the system. Here, the MEXPLORER

<sup>&</sup>lt;sup>1</sup>The name of this version indicates that it is a release candidate used for the interactive discussion in GMDD. If necessary, bug fixes can still be made. The release of the final version MEXPLORER-1.0.0 is planned together with the final paper in GMD.

<sup>&</sup>lt;sup>2</sup>http://mcm.york.ac.uk





(mechanism explorer) software is presented, which contains several tools to identify, analyze and visualize important parts of complex reaction mechanisms. Its main features are described in the following sections. Additional information is provided in the user manual, which contains detailed instructions how to install and use the code. Although this work focuses on atmospheric chemistry, the software can be used in other fields as well, e.g., chemical engineering or marine chemistry.

# 2 Description

From a mathematical point of view, a set of chemical reactions can be seen as a directed graph (digraph). There are several ways to define such a digraph, for example with a bipartite graph where both, species and reactions, are represented by vertices (e.g., Silva et al., 2020). For MEXPLORER, however, reactions are represented as edges pointing directly from the reagents to

30 the products. Especially for the visualization of complex mechanisms (see below), this produces plots with much less visual clutter.

Taking the above-mentioned Chapman mechanism as an example, a graph with 3 vertices  $(V_1 \dots V_3)$  and 7 edges  $(E_1 \dots E_7)$  can be constructed:

$V_1$ :	0			
$V_2$ :	$O_2$			
V <sub>3</sub> :	$O_3$			
$E_1$ :	0	$\rightarrow$	$O_2$	(R1)
$E_2$ :	0	$\rightarrow$	$O_3$	(R2)
E <sub>3</sub> :	$O_2$	$\rightarrow$	Ο	(R3)
$E_4$ :	$O_2$	$\rightarrow$	$O_3$	(R2)
$E_5$ :	$O_3$	$\rightarrow$	Ο	(R4)
$E_6$ :	$O_3$	$\rightarrow$	$O_2$	(R1)
E <sub>7</sub> :	$O_3$	$\rightarrow$	$O_2$	(R4)

35 As input, MEXPLORER needs a text file defining the chemical species and the mechanism in KPP format (Sandu and Sander, 2006). For the Chapman mechanism, the species and their elemental composition are:

0 = 0;02 = 20;03 = 30;

40 The reactions are defined as:

<R1> 03 + 0 = 2 02 : k1; <R2> 02 + 0 = 03 : k2;







Figure 1. Graph of the Chapman mechanism, created with MEXPLORER.



Figure 2. Reactions from  $C_5H_8$  (isoprene) to CO in the MOM mechanism.

<R3> 02 + hv = 2 0 : k3; <R4> 03 + hv = 0 + 02 : k4;

Many atmospheric-chemistry models are already using KPP, thus, importing their mechanisms into MEXPLORER is straightforward. Once the mechanism has been stored in the graph-tool-specific xml format, several tools and algorithms from graph theory can be applied in order to analyze, reduce and visualize (Fig. 1) the chemical mechanism, as discussed in the following sections.

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The installation requires version 3.6 of Python<sup>3</sup> and graph-tool<sup>4</sup>. Drawing the graphs is based on Graphviz<sup>5</sup>. Execution of the code is controlled via configuration files, using the Python ConfigParser. 50

### 2.1 Visualization

MEXPLORER can create a plot of the whole mechanism or a selected subset and save it as a vector graphic in pdf format. According to "a picture is worth a thousand words", such plots can provide an informative overview for presentations and publications. The user can adjust several features of the plot.

#### 55 2.1.1 Vertices (species)

Chemical species are represented as vertices of the graph. To increase the amount of information contained in the plot, MEX-PLORER offers several options to tune the background color and labels of the vertices:

- For plots showing the pathways from a source species to a target species, this can be emphasized with a red background color for the source and a green background color for the target. Intermediates in the path are shown with a yellow background color (see Fig. 2).

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- To illustrate the degradation of large organic molecules in a chain of reactions, the number of carbon atoms can be used to determine the background color, as in Fig. 3.
- In a multiphase chemical mechanism, different colors can be used for gas- and aqueous-phase species, respectively. This coloring option is used in Fig. 4, where the aqueous-phase species contain the suffix "\_a01".
- 65 - Another area of application is the skeletal reduction of a complex mechanism. Here, an overall interaction coefficient (OIC) is calculated for every species in the mechanism. A high OIC value indicates an important species. Species with an OIC below a certain threshold are removed from the mechanism. MEXPLORER can read such OIC values from a file and use them to define the vertex background color. In addition, the OIC values can be shown inside the vertices below the names of the species. This produces a clear representation of the reduced mechanism (see for example Fig. 4 in Sander et al. (2019)).

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Alternative representations of the vertex properties can be created with additional Python functions, if needed.

#### 2.1.2 Edges (reactions)

Chemical reactions are represented as directed edges of the graph. To increase the amount of information contained in the plot, MEXPLORER offers several options to tune the thickness, color and labels of the edges:

<sup>&</sup>lt;sup>3</sup>https://www.python.org/

<sup>&</sup>lt;sup>4</sup>https://graph-tool.skewed.de

<sup>&</sup>lt;sup>5</sup>https://graphviz.org



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- When reaction rates are available, they can be used to define the line thickness of the edge arrows. This is especially useful to highlight important reactions found in maximum flow calculations, as in Figs. 2 and 4.
  - Edge labels are used to identify reactions. In Fig. 1, the reaction numbers (R1,...,R4) are shown. Although this is a unique and consise way to describe edges, it requires the look-up of the reactions that correspond to these reaction numbers. An alternative is to label edges with the other reactants of the reaction (as in Figs. 2, 3, 4, and 5). For photochemical reactions, the label " $h\nu$ " is used, and first-order reactions are labeled with "1st". Unfortunately, the graphs quickly become unreadable with increasing complexity of the chemical mechanism. To alleviate this problem, MEXPLORER can merge parallel edges and their labels. For example, the Chapman mechanism in Fig. 1 contains two reactions that convert  $O_3$  to  $O_2$ : R1 and R4. After merging the corresponding edges, a new label with a comma-separated list is created: "R1,R4". When the edge labels become too long, they are abbreviated to "n rxns", indicating that there are *n* reactions contributing to this edge. Examples of labels generated this way can be seen in Figs. 2, 3, 4 and 5.

Alternative representations of the edge properties can be created with additional Python functions, if needed.

#### 2.1.3 Filters (reduced mechanism)

Plotting the complete graph of a complex mechanism will be unreasonable in many cases, making it necessary to extract a subset in order to obtain a clearly arranged plot. Available filters are:

- 90 It is possible to select only species containing a specified element. For example, organic chemistry is selected with "element=C".
  - From a multiphase mechanism, a specific phase can be selected, e.g., "phase=gas" or "phase=aqueous".
  - Species that should not appear in a plot can be put into a blacklist, e.g., "blacklist=CO". Likewise, species that should always appear in the plot, even though they have already been removed by another filter, can be put into a whitelist, e.g., "whitelist=CO2".
  - It is possible to remove slow reactions, i.e., all edges below a specified reaction rate, e.g., "minrxnrate=1E-19".
  - When studying the degradation of organic molecules, it is often helpful to remove all edges where the number of C atoms increases, using "l\_filter\_out\_C\_increase=True". See Sect. 2.2 for details.
  - The max-flow algorithm (Sect. 2.3.1) filters out all reactions that do not contribute to the maximum flow from a source species to a target.
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- Filters for special cases can be created by adding individual functions to the Python code. For example, MEXPLORER includes a function for the JAMOC mechanism, which excludes all gas-phase species, all inorganic species, and all species that don't have any chemical sources or sinks in the aqueous phase (only transfer from the gas phase). The option is activated with "vfilter=jamoc".







Figure 3. Reactions from  $C_5H_8$  (isoprene) to MACR (methacrolein) in the MCM. Different colors are used for species with 5 and 4 carbon atoms.

#### 105 2.1.4 Interactive visualization

There is also an option to explore a mechanism interactively in a GTK+ window. It is possible to pan, zoom or rotate the graph. A group of vertices can be selected to drag or rotate them together. For reordering the vertices, the dynamic spring-block layout can be activated. Sources and sinks of selected species can be shown. Additional Python functions can be written to activate more keystrokes in the interactive window.

#### 110 2.2 Mechanism development

MEXPLORER can be used as a tool during mechanism development. Several sanity checks can be performed quickly while a new mechanism is under construction.

- MEXPLORER can show precursors and successors of selected species. As an example, the graph in Fig. 5 was created with the command "neighbors=VINOH, 1, 1". It shows all species in MOM that are directly connected to ethenol







Figure 4. Reaction pathways from HCHO (red) to  $CO_2$  (green) in JAMOC. The oxidation takes place in both the gas phase (yellow species) and also in the aqueous phase (blue species with the suffix "\_a01").

115 (vinyl alcohol, VINOH). Such a visualization can help to find missing sources or sinks while a mechanism is under construction. Using larger numbers, e.g., "neighbors=VINOH, 2, 3" creates a more complex graph with all species that can produce VINOH within 2 steps and all species that are produced from VINOH within 3 steps.







Figure 5. Sources and sinks of ethenol (VINOH, yellow) in MOM. Species that can produce VINOH are shown in red, and species that are produced from VINOH are shown in green. Species for which both applies are shown on a white background.

- MEXPLORER can find all reaction pathways from a source to a target species. Fig. 3 was produced with "vfilter=src\_tgt", "src=C5H8", and "tgt=MACR". It shows the reaction chain transforming isoprene into methacrolein.
- Often, a mechanism is created to study the degradation of large organic molecules with a monotonic decrease of the 120 number of carbon atoms with each reaction step ( $\Delta C \leq 0$ ). To remove all edges in which the number of carbon atoms increases ( $\Delta C > 0$ ), "1\_filter\_out\_C\_increase=True" can be defined in the config file. Without such filtering, edges like for example  $CO \rightarrow RO$  from the reactions of peroxy radicals with carbon monoxide ( $RO_2$  +  $CO \rightarrow RO$  + CO<sub>2</sub>) would remain in the graph, adding even more reactions and unwanted complexity to the plot.
- 125 - While creating a graph from the KPP input files, the mechanism can be checked for unintentional mass balance violations. Specific elements are selected with e.g., "mass\_balance=C, N, Cl". Of course, this feature requires that the elemental composition of the chemicals has been defined in the input file.
  - For most species in a mechanism, both chemical sources and sinks exist. A few have no sources or no sinks. This may be intentional (for example, terpenes are destroyed but not produced in atmospheric chemistry mechanisms) but it may also point to missing reactions in the mechanism under construction. With MEXPLORER, it is easy to scan the whole mechanism for such species (called "leaves" in graph theory) with "1 show primary=True" and "1 show final=True".
    - Graph theory provides many algorithms that can assign key values, either to the whole graph or to individual vertices. These tools can be applied to chemical mechanisms, when they are available as graphs. For example, Silva et al. (2020)

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used the graph properties modularity and reciprocity to compare mechanisms of different complexity. MEXPLORERprovides access to all algorithms which are implemented in graph-tool.

## 2.3 Mechanism evaluation

If turnover rates of individual reactions are available, they can be imported into MEXPLORER and used to evaluate the results of a model simulation.

# 2.3.1 The max-flow problem (finding important reaction pathways)

- 140 Often, a key question is not only how much of a certain species has been produced but also which reaction pathways are the most important ones, going from a source to a target species. In terms of graph theory, this corresponds to a maximum flow problem. MEXPLORER offers three algorithms provided by graph-tool:
  - Edmonds-Karp algorithm (Edmonds and Karp, 1972)
  - Push-relabel algorithm (Goldberg and Tarjan, 1986)
- 145 Boykov-Kolmogorov algorithm (Boykov and Kolmogorov, 2004)

Fig. 2 shows the reactions leading from  $C_5H_8$  (isoprene) to CO. Using the Edmonds–Karp algorithm, the thickness of the arrows indicates the importance of individual pathways.

Another example is shown in Fig. 4 where the reaction sequence from HCHO to CO<sub>2</sub> in JAMOC is analyzed. This mechanism contains gas-phase as well as aqueous-phase reactions. The Edmonds–Karp algorithm yields important pathways in both 150 phases.

# 2.3.2 Strongly connected components (chemical "families")

Mechanisms often contain very fast reactions which form catalytic cycles. They may also contain null cycles which neither produce or remove any species, i.e., have a net effect of zero. In atmospheric chemistry, species are often grouped into so-called families (Crutzen and Schmailzl, 1983). They are defined such that reactions inside the null cycles transform species
only within the family but don't change the sum of the family members. Taking the Chapman mechanism as an example again, an "odd oxygen" family can be defined as the sum of O and O<sub>3</sub>. Neither reaction (R2) nor (R4), which together form a null cycle, change the amount of odd oxygen.

Trying to find important reactions in a complex mechanism can be hampered by fast reactions inside null cycles. Therefore, it is important to detect them and define suitable families. MEXPLORER can be used to locate fast cycles above a specified

160 threshold in a complex mechanism. Using the command "family=1E-14", MEXPLORER will list all families, in which the members can be interconverted at a rate of  $\geq 10^{-14}$ . When plotting the graph of the mechanism, all reactions inside the families are shown as red arrows. In terms of graph theory, MEXPLORER first creates a subgraph where the edge property "reaction rate" is above the specified threshold. Next, it finds all strongly connected components in the subgraph.





# 3 Summary and outlook

165 The MEXPLORER software was presented which can be used to analyze, reduce, and visualize complex chemical reaction mechanisms.

Currently, MEXPLORER can only import reaction rates at one selected time step. A planned extension is to read reaction rates at several time steps, e.g., for a whole day. This will allow the creation of movies with changing arrow widths, visualizing how important pathways may change throughout the diurnal cycle.

170 *Code availability.* MEXPLORER is available as a community model published under the GNU General Public License<sup>6</sup>. The model code and the user manual are available at https://doi.org/10.5281/zenodo.8132472. MEXPLORER will also be included in the next version of the CAABA/MECCA atmospheric chemistry box model at https://gitlab.com/RolfSander/caaba-mecca.

*Competing interests.* R.S. is a member of the editorial board of GMD. The peer-review process is guided by an independent editor, and the author has no other competing interests to declare.

175 *Author contributions*. R.S. developed MEXPLORER and wrote the paper.

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<sup>&</sup>lt;sup>6</sup>http://www.gnu.org/copyleft/gpl.html





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