# Iggy - User Guide (version 2.0.0)

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## What are iggy and opt\_graph?

iggy and optgraph are tools for consistency based analysis of influence graphs and observed systems behavior (signed changes between two measured states). For many (biological) systems are knowledge bases available that describe the interaction of its components in terms of causal networks, boolean networks and influence graphs where edges indicate either positive or negative effect of one node upon another.

iggy implements methods to check the consistency of large-scale data sets and provides explanations for inconsistencies. In practice, this is used to identify unreliable data or to indicate missing reactions. Further, iggy addresses the problem of repairing networks and corresponding yet often discrepant measurements in order to re-establish their mutual consistency and predict unobserved variations even under inconsistency.

opt\_graph confronts interaction graph models with observed systems behavior from multiple experiments. opt\_graph computes networks fitting the observation data by removing (or adding) a minimal number of edges in the given network.

You can download the precompiled binaries for 64bit linux and macos on the release page.

Sample data is available here: demo data.tar.gz

# **Compile yourself**

Clone the git repository:

```
git clone https://github.com/bioasp/iggy.git
cargo build --release
```

The executables can be found under ./target/release/

# **Input Model + Data**

iggy and opt\_graph work with two kinds of data. The first is representing an interaction graph model. The second is the experimental data, representing experimental condition and observed behavior.

### Model

The model is represented as file in complex interaction format CIF as shown below. Lines in the CIF file specify a interaction between (multiple) source nodes and one target node.

In our influence graph models we have simple interactions like: in Line 1 for shp2 *increases* grb2\_sos and in Line 2 the ! indicates that mtor\_inhibitor tends to *decrease* mtor . in Line 3 the ? indicates an unknown influence of jak2\_p on stat5ab\_py . Complex interactions can be composed with the & operator to model a combined influence of multiple sources on a tartget. In Line 4 an decrease in ras\_gap with an increase in grb2\_sos tend to increase pi3k .

### **Experimental data**

The experimental data is given in the file format shown below. Nodes which are perturbed in the experimental condition are denoted as <code>input</code>. The first line of the example below states that depor has been perturbed in the experiment. This means depor has been under the control of the experimentalist and its behavior must therefore not be explained. The behavior of a node can be either <code>+</code>, <code>-</code>, <code>0</code>, <code>notPlus</code>, <code>notMinus</code>. Line 2 states that an <code>increase(+)</code> was obeserved in depor, as it is declared an <code>input</code> this behavior has been caused by the experimentalist. Line 3 states that <code>stat5ab\_py</code> has <code>decreased(-)</code> and line 4 states that <code>ras</code> has <code>not changed(0)</code>. Line 5 states that an <code>uncertain decrease(notPlus)</code> has been observed in <code>plcg</code> and line 6 states that an <code>uncertain increase(notMinus)</code> has been observed in <code>mtorc1</code>. Line 7 states that <code>akt</code> is initially on the minimum level, this means it cannot further decrease, and line 8 states that <code>grb2\_sos</code> is initially on the maximum level, this means it cannot further increase.

# **Iggy**

iggy performs consistency checks for an interaction model and a data profile. It computes explanations (minimal inconsistent cores *mics*) for inconsistencies and suggests repairs for model and data.

The *mics* are connected parts of the model and indicate unreliable data or missing reactions. The repairs re-establish the mutual consistency between model and data, and enable predictions of unobserved behavior even under inconsistency.

The typical usage of iggy is:

```
$ iggy -n network.cif -o observation.obs -l 10 -p
```

For more options you can ask for help as follows:

```
$ iggy -h
iggy 2.0.0
Sven Thiele <sthiele78@gmail.com>
Iggy confronts interaction graph models with observations of (signed) changes between
two measured states (including uncertain observations). Iggy discovers inconsistencies
in networks or data, applies minimal repairs, and predicts the behavior for the
unmeasured species. It distinguishes strong predictions (e.g. increase in a node) and
weak predictions (e.g., the value of a node increases or remains unchanged
USAGE:
    iggy [FLAGS] [OPTIONS] --network <networkfile>
FLAGS:
    -a, --autoinputs
                                    Declare nodes with indegree 0 as inputs
        --depmat
                                    Combine multiple states, a change must be explained
                                    by an elementary path from an input
        --elempath
                                    Every change must be explained by an elementary
                                    path from an input
                                    Disable foundedness constraints
```

--founded\_constraints\_off Disable forward propagation constraints --fwd\_propagation\_off -h, --help Prints help information --mics Compute minimal inconsistent cores --scenfit Compute scenfit of the data, default is mcos -p, --show\_predictions Show predictions -V, --version Prints version information OPTIONS: -1, --show\_labelings <max\_labelings> Show max\_labelings labelings, default is OFF, -n, --network <networkfile> Influence graph in CIF format -o, --observations <observationfile> Observations in bioquali format

## Compute *mcos* or *scenfit* and predictions under inconsistency

iggy implements two measures for inconsistency mcos and scenfit. While mcos measures the minimal number of observations that cannot be explained, scenfit measures a minimal number of changes to the model to re-establish the mutual consistency between model and data. The default in iggy is mcos but scenfit can be used with the option --scenfit .

With the option --show\_labelings, -1 N iggy computes at most N such labelings and repairs that are consistent.

With the flag --show\_predictions, -p iggy computes predictions under inconsistencies. More precisely the behaviors of the system that are invariant also under the minimal repairs.

iggy presents the results of its analysis as text output. The output of iggy can be redirected into a file using the > operator. For example to write the results shown below into the file myfile.txt type:

```
$ iggy -n network.cif -o observations.obs -l 10 -p > myfile.txt
```

In the following we will dissect the output generated by <code>iggy</code> . The first 3 lines of the output state the constraints that have been used to analyze network and data. For our example it is the default setting with the following constraints. For a deeper understanding of these constraints see~\cite{sthiele15}.

- + All observed changes must be explained by an predecessor.
- + 0-change must be explained.
- + All observed changes must be explained by an input.

\_\_\_\_\_

Next follow some statistics on the input data. Line 4-5 tells us that the influence graph model given as network.cif consists of 18 species nodes and 4 complex nodes, with 19 edges with activating influence and 6 edges with inhibiting influence and 1 edge with Unknown influence.

Line 9 tells that the experimental data given as observation.obs in itself is consistent, which means it does not contain contradictory observations. Line 11 tells that the experimental conditions has 2 perturbations marked as input nodes, that 4 nodes were observed as increased +, 1 node decreased (-), 7 nodes did not change (0), 1 node were observed with an uncertain decrease (notPlus), 1 node were observed with an uncertain increase (notMinus), 1 node were observed with an minimum level (MIN), 1 node were observed with an maximum level (MAX), 4 nodes were unobserved and the experimental data contained 0 observations of species that are not in the given model.

```
Reading network model from "network.cif".
# Network statistics
   OR nodes (species): 18
   AND nodes (complex regulation): 4
   Activations = 19
    Inhibitions = 6
   Unknowns = 1
Reading observations from "observations.obs".
# Observations statistics
    unobserved nodes
                       : 4
    observed nodes
                        : 18
    inputs
                         : 2
                          : 4
                          : 1
    0
                          : 7
    notPlus
    notMinus
                          : 1
    Min
                          : 1
    Max
                          : 1
    observed not in model: 0
```

Then follow the results of the consistency analysis. Line 14 tells us that network and data are inconsistent and that the size of a *minimal correction set* ( mcos ) is 2. This means that at least 2 influences need to be added to restore consistency. For a deeper understanding of mcos see~\cite{samaga13a}. Further the output contains at most 10 consistent labeling including correction set. This is because we choose to set the flag --show\_labelings 10. In our example we have 4 possible labelings. Each labeling represents a consistent behavior of the model (given mcos the corrections). Labeling 1, tells it is possible that mek1 *increases* (+), shp2\_ph and mtorc do *not change* (0) and that stat5ab\_py *decrease* (-). Line 26 tells us that this is a consistent behavior if MTOR would receive a positive influence, which is currently not included in the model. Labeling 3, represents an alternative behavior, here mtorc1 does *increases* (+}). Please note that in this example both labelings are consistent under the same correction set. In another example more than one minimal correction set could exists.

Compute mcos labelings ... done. Labeling 1: mtorc1 = 0 $ras_gap = 0$ shp2 = 0 $gab1\_bras\_py = 0$  $jak2_p = 0$ mek1 = +erk = +brb2 = 0akt = 0 $stat5ab_py =$ brb =  $gab1_ps = +$  $grb2\_sos = 0$ socs1 = 0pi3k = 0mtor = 0mtor\_inhibitor = 0 depor = +Repairs: Labeling 2: mtorc1 = 0 $ras_gap = 0$ shp2 = 0 $gab1\_bras\_py = 0$  $jak2_p = 0$ mek1 = +erk = +brb2 = 0akt = 0 $stat5ab_py =$ brb = + $gab1_ps = +$  $grb2\_sos = 0$ socs1 = 0pi3k = 0mtor = 0mtor\_inhibitor = 0 depor = +Repairs: Labeling 3: mtorc1 = +

 $ras_gap = 0$ 

The network and data are inconsistent: mcos = 2.

```
shp2 = 0
    gab1\_bras\_py = 0
    jak2_p = 0
    mek1 = +
    erk = +
    brb2 = -
    akt = 0
    stat5ab_py = -
    brb = -
    gab1_ps = +
    grb2\_sos = 0
    socs1 = 0
    pi3k = 0
    mtor = 0
    mtor_inhibitor = 0
    depor = +
Repairs:
Labeling 4:
    mtorc1 = +
    ras_gap = 0
    shp2 = 0
    gab1\_bras\_py = 0
    jak2_p = 0
    mek1 = +
    erk = +
    brb2 = -
    akt = 0
    stat5ab_py = -
    brb = +
    gab1_ps = +
    grb2\_sos = 0
    socs1 = 0
    pi3k = 0
    mtor = 0
    mtor_inhibitor = 0
    depor = +
 Repairs:
```

Finally the prediction results are listed. A prediction is a statement that hold under all labeling under all minimal repairs. For a formal definition of predictions see~\cite{sthiele15}. Here the predictions say that gab1\_ps always increases (+), stat5ab\_py always decreases (-), shp2 always stays unchanged (0), mtorc1 never decreases (notMinus), and brb2 always stays never increases (notPlus),

Compute predictions under mcos ... done.

```
# Predictions:
   mek1 = +
   erk = +
   gab1_ps = +
   depor = +
   stat5ab_py = -
   ras_gap = 0
   shp2 = 0
   gab1\_bras\_py = 0
   jak2_p = 0
   akt = 0
   grb2\_sos = 0
   socs1 = 0
   pi3k = 0
   mtor = 0
   mtor_inhibitor = 0
   brb2 = notPlus
   mtorc1 = notMinus
   brb = CHANGE
   predicted +
                      = 4
   predicted -
                      = 1
   predicted 0
   predicted notPlus = 1
   predicted notMinus = 1
   predicted CHANGE = 1
```

# Compute minimal inconsistent cores --mics

lggy computes minimal inconsistent cores *mics* for inconsistent model and data. The *mics* are connected parts of the model and indicate unreliable data or missing reactions.

```
$ iggy -n data/Yeast/yeast_guelzim.cif -o data/Yeast/yeast_snf2.obs --mics
+ All observed changes must be explained by an predecessor.
+ 0-change must be explained.
+ All observed changes must be explained by an input.
Reading network model from "data/Yeast/yeast_guelzim.cif".
# Network statistics
OR nodes (species): 477
AND nodes (complex regulation): 0
Activations = 665
Inhibitions = 270
Unknowns = 0
Reading observations from "data/Yeast/yeast_snf2.obs".
# Observations statistics
   unobserved nodes : 388
observed nodes : 574
    inputs
                         : 0
                          : 376
                         : 198
                          : 0
    0
    notPlus
                          : 0
    notMinus
                          : 0
    Min
                          : 0
    Max
                          : 0
     observed not in model: 485
Computing mcos of network and data ... done.
The network and data are inconsistent: mcos = 530.
Computing minimal inconsistent cores (mic's) ... done.
mic 1:
   YAL063C YER065C
mic 2:
   YBR159W YNL009W
mic 3:
   YJL159W YGR108W
mic 4:
   YPR119W YGR108W
```

```
mic 5:
    YMR307W YIL013C
mic 6:
    YNL241C YLR109W
mic 7:
    YOL006C YMR186W
mic 8:
    YGR108W YDR224C YAL040C
mic 9:
    YPL256C YIL072W YNL210W YGR044C YPR119W YJL194W YJL106W YDL179W YOR159C YHR055C YLR131C
mic 10:
    YPL256C YIL072W YNL210W YGR044C YJL194W YJL106W YDL179W YOR159C YHR055C YLR131C YDR522C
mic 11:
    YPL256C YIL072W YJL159W YNL210W YGR044C YJL194W YJL106W YDL179W YOR159C YHR055C YLR131C
mic 12:
    YPL256C YMR199W YIL072W YGL089C STA3 YLR452C YNL210W YIL099W YGR044C YIR019C YJL157C YBR
mic 13:
    YCR065W YOL116W YKR099W YGL073W YBR279W YGL025C YDR448W YDR392W YIR023W YLR451W YBR112C
```

# Opt\_graph

opt\_graph confronts interaction graph models with observed systems behavior from multiple experiments. opt\_graph computes networks fitting the observation data by removing (or adding) a minimal number of edges in the given network.

Typical usage is:

```
$ opt_graph -n network.cif -o observations_dir/ --show_repairs 10
```

For more options you can ask for help as follows:

\$ opt\_graph -h
opt\_graph 2.0.0

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Opt-graph confronts interaction graph models with observations of (signed) changes between two measured states. Opt-graph computes networks fitting the observation data by removing (or adding) a minimal number of edges in the given network

#### USAGE:

opt\_graph [FLAGS] [OPTIONS] --network <networkfile> --observations <observationdir>
FLAGS:

-a, --autoinputs Declare nodes with indegree 0 as inputs

--depmat Combine multiple states, a change must be explained by

an elementary path from an input

--elempath Every change must be explained by an elementary path

from an input

--fwd\_propagation\_off Disable forward propagation constraints

-h, --help Prints help information
-V, --version Prints version information

#### OPTIONS:

-r, --show\_repairs <max\_repairs> Show max\_repairs repairs, default is OFF, 0=all

-n, --network <networkfile> Influence graph in CIF format

-o, --observations <observationdir> Directory of observations in bioquali format

-m, --repair\_mode <repair\_mode> Repair mode: remove = remove edges (default),

optgraph = add + remove edges, flip = flip direction of edges