

Supplementary Material

The Design of FluxML: A Universal Specification Language for ¹³C Metabolic Flux Analysis

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1 Selected publicly available software systems for ^{13}C MFA

Supplementary Table 1.1. Collection of software tools for ^{13}C MFA and their modeling format-related features (sorted by publication date).

Software	Type	Programing language	Model specification interface, Document type/format	Comments	Citation
13CFLUX Siegen University, Siegen, Germany 2001	Classical	C++	Text-based, FTBL	Meas. type: universal Atom mappings: letter State var.s: Cumomer	doi: 10.1006/mben.2001.0188
tcaSIM, tcaCALC Southwestern University Georgetown, Texas 2004	Classical	DOS	n.a. (fixed model)	Meas. types: NMR, MS Atom mappings: n.a. State var.s: isotopomers	doi: 10.1016/j.ymben.2003.10.007
FIATFLUX (SumoFlux) ETH Zurich Zurich, Switzerland 2005 (2016)	Flux ratios	Matlab	GUI, text-based, netCDF (data), MAT-file	Meas. type: MS Atom mappings: n.a. (preconfigured flux ratios for [1- ^{13}C]- and [U- ^{13}C])	doi: 10.1371/journal.pcbi.1005109
METRAN MIT, Cambridge, Massachusetts, University of Delaware Newark, Delaware 2005	Classical	Matlab	GUI text-based, MAT-file	Meas. type: NMR, MS Atom mappings: letter State var.s: EMU	doi: 10.1074/jbc.M706494200
OpenFlux University of Queensland Brisbane, Australia 2009	Classical	Matlab	Text-based, FTBL derivate	Meas. type: MS Atom mappings: letter State var.s: EMU	doi: 10.1186/1475-2859-8-25

C13 Chalmers University of Technology, Göteborg, Sweden 2010	Classical	Matlab	Text-based, CSV	Meas. type: MS Atom mappings: letter State var.s: Isotopomer	doi: 10.1093/nar/gkq404
influx_s / influx_si Université de Toulouse Toulouse, France 2012, 2014	Classical, INST	R, Python	Text-based, FTBL	Meas. type: universal Atom mappings: letter State var.s: Cumomer, EMU	doi: 10.1093/bioinformatics/btr716
13CFLUX2 Forschungszentrum Jülich Jülich, Germany 2012	Classical, INST	C++	GUI via Omix, Text-based, FluxML	Meas. type: universal Atom mappings: INCHI, letter State var.s: Cumomer, EMU	doi: 10.1093/bioinformatics/bts646
INCA Vanderbilt University Nashville, Tennessee 2013	Classical, INST	Matlab	GUI, MAT-file	Meas. type: MS Atom mappings: letter State var.s: EMU	doi: 10.1093/bioinformatics/btu015
OpenFlux2 Ajinomoto-Genetika Research Institute, Moscow, Russia 2014	Classical	Matlab	Text-based, FTBL derivate	Meas. type: MS Atom mappings: letter State var.s: EMU	doi: 10.1186/s12934-014-0152-x
OpenMebius Osaka University Osaka, Japan 2014	INST	Matlab	Text-based, CVS	Meas. type: MS Atom mappings: letter State var.s: EMU	doi: 10.1155/2014/627014
WUFlux Washington University St. Louis, Missouri 2016	Classical	Matlab	GUI, text-based, MAT-file, CSV	Meas. type: MS Atom mappings: letter State var.s: EMU	doi: 10.1186/s12859-016-1314-0

Sysmetab Sorbonne University Paris, France 2017	Classical, INST	Scilab	Text-based, FluxML	Meas. type: universal Atom mappings: letter State var.s: Cumomer	doi: 10.1109/TCBB.2016.2544299
jQMM Lawrence Berkeley National Laboratory Emeryville, California 2017	Classical	Python	Text-based, SBML	Meas. type: MS Atom mappings: letter State var.s: EMU	doi: 10.1186/s12859-017-1615-y
FluxPyt International Centre for Genetic Engineering and Biotechnology New Delhi, India 2018	Classical	Python	Text-based, FTBL derivate	Meas. type: MS Atom mappings: letter State var.s: EMU	doi: 10.7717/peerj.4716

3 Typical FluxML error messages and warnings

Example 1: Erroneous atom mappings and the corresponding error message reported:

```
<reaction bidirectional="false" id="w">
  <reduct cfg="C#1@1 C#2@1 C#3@1 C#4@1" id="C"/>
  <rproduct cfg="C#2@1 C#3@1 C#5@1" id="D"/>
  <rproduct cfg="C#1@1" id="F"/>
</reaction>
```

```
>> fmlint -i Spirallus.fml
```

```
illegal permutation -- C#4@1 unmatched in cfg of reaction w
XML exception: reaction "w": illegal permutation in atom transitions
```

```
location: #document/fluxml/reactionnetwork/reaction
node details: #<reaction bidirectional="false" id="w"/>
```

FluxML parsing error: reaction "w": illegal permutation in atom transitions

Example 2: Number of atoms not matching:

```
<pool atoms="2" id="F"/> [...]
<reaction bidirectional="false" id="w">
  <reduct cfg="C#1@1 C#2@1 C#3@1 C#4@1" id="C"/>
  <rproduct cfg="C#2@1 C#3@1 C#4@1" id="D"/>
  <rproduct cfg="C#1@1" id="F"/>
</reaction>
```

```
>> fmlint -i Spirallus.fml
```

```
element "rproduct" (id="F"): "cfg" attribute shows 1 labeling positions whereas pool
definition specifies 2 labeling postions
```

```
location: #document/fluxml/reactionnetwork/reaction/rproduct
node details: #<rproduct cfg="C#4@1" id="F"/>
XML exception: [element "rproduct" (id="F"): "cfg" attribute shows 1 labeling positions
whereas pool definition specifies 2 labeling postions] in reaction "w"
```

FluxML parsing error: [element "rproduct" (id="F"): "cfg" attribute shows 1 labeling positions whereas pool definition specifies 2 labeling postions] in reaction "w"

Example 3: A non-existing reaction is referred to in the constraints:

```
<reaction bidirectional="false" id="u">...</reaction>
<reaction bidirectional="false" id="v">...</reaction>
<reaction bidirectional="false" id="w">...</reaction>
<reaction bidirectional="false" id="p">...</reaction>
<reaction bidirectional="true" id="q">...</reaction>
<reaction bidirectional="false" id="r">...</reaction>
...
<constraints>
  <net>
    <textual> u &lt;= 1; a= 1; <textual>
  </net>
</constraints>
```

```
>> fmlint -i Spirallus.fml
```

```
XML exception: element XML exception: invalid reaction name "a" in constraint
"anonymous" (a=1)
```

```
location: #document/fluxml/constraints/net/textual/#text
node details: #text{u <=1; a=1;}
```

FluxML parsing error: invalid reaction name "a" in constraint "anonymous" (a=1)

Example 4: Forgotten tags `<textual>` `</textual>` in the `net constraints` section:

```
<constraints>
  <net>
    u &lt;= 1;
  </net>
</constraints>
```

```
>> fmlint -i Spirallus.fml
```

```
XML exception: element XML XML exception: XML parser (error): no character data is
allowed by content model in /home/fluxml/examples/Spirallus.fml;
row: 53, column: 10
```

```
location: #document/fluxml/constraints/net
node details: #<net/>
```

```
XML exception: XML parser (error): no character data is allowed by content model in
/home/fluxml/examples/Spirallus.fml; row: 54, column : 1
```

```
location: #document/fluxml/constraints/net
node details: #<net/>
```

```
XML exception: XML parser (error): empty content is not valid for content model
'(textual|math)' in /home/fluxml/examples/Spirallus.fml; row: 54, column: 7
```

```
location: #document/fluxml/constraints/net
node details: #<net/>
```

```
XML exception: net constraints in textual- or MathML notation expected
location: node details: (null)
```

FluxML parsing error: net constraints in textual- or MathML notation expected

Example 5: Incomplete XML tree; missing tags in “xch constraints” section:

```
<fluxml>
  <reactionnetwork> .... </reactionnetwork>
  <constraints>
    <xch> q &lt;= 0.7; </xch>
  <configuration > ... </configuration>
```

```
>> fmlint -i Spirallus.fml
```

```
XML exception: XML parser (fatal error): expected end of tag 'xch' in /home/
fluxml/examples/Spirallus.fml; row: 58, column: 3
location: #document/fluxml/constraints/xch/#text
node details: #text{ }
```

or

```
XML exception: element XML xmllint Spirallus.fml
Spirallus.fml:58: parser error : Opening and ending tag mismatch: xch line 55 and
constraints
</constraints>
```

```
Spirallus.fml:118: parser error : Opening and ending tag mismatch:
constraints line 51 and fluxml
</fluxml>
```

Spirallus.fml:119: parser error : Premature end of data in tag fluxml line 2

Example 6: “xch constraints” section not properly closed:

```
<constraints>
  <net>
    <textual> u &lt;=1;</textual>
  </net>
  <xch>
    <textual>q &lt;=1</textual>
  </constraints>
```

```
>> fmlint -i Spirallus.fml
```

```
XML exception: XML exception: XML parser (fatal error): expected end of tag 'fluxml' in
/home/fluxml/examples/Spirallus.fml; row: 115, column: 3
location: #document/fluxml/#text
node details: #text{ }
```

```
XML exception: element node (configuration) expected.
location: #document/fluxml/comment node details: #<comment/>
```

FluxML parsing error: element node (configuration) expected.

Example 7: Isolated sub-network detected (typically isolated nodes or sub-networks are unintentionally introduced during the modeling process and not recognized by the modeler):

```
<reaction> ... </reaction>
<!-- isolated-subnetwork -->
<reaction bidirectional="false" id="h">
  <reduct cfg="C#1@1 " id="H"/>
  <rproduct cfg="C#1@1 " id="G"/>
</reaction>
```

```
>> fmlint -i Spirallus.fml
```

```
pool "H" has no efflux (set at least one incident exchange flux >0) missing input pool
specification (cfg: "default", pool: "G") XML exception: validation of configuration default
failed!
```

```
FluxML parsing error: validation of configuration default failed!
```

4 Miscellanea

4.1 A use case for Content-MathML

The measurement group of the tandem MS measurement fragment $ALA[1-3:1-2]$ with measurement error model

$$\text{meas_sim} * (0.000780 + (\text{meas_sim}^{-0.739716})) / (40.001740 + \text{meas_sim}^{-0.739316})$$

reads, using Content-MathML, as follows:

```
<group id="LCMSMS_Ala_3_2">
  <errormodel>
    <math xmlns="http://www.w3.org/1998/Math/MathML">
      <apply>
        <times/>
        <ci>meas_sim</ci>
        <apply>
          <plus/>
          <cn type="e-notation">7.8<sep/>-4</cn>
          <apply>
            <divide/>
            <apply>
              <power/>
              <ci>meas_sim</ci>
              <apply>
                <minus/>
                <cn type="real">0.739716</cn>
              </apply>
            </apply>
          <apply>
            <plus/>
            <cn type="real">40.00174</cn>
            <apply>
              <power/>
              <ci>meas_sim</ci>
              <apply>
                <minus/>
                <cn type="real">0.739316</cn>
              </apply>
            </apply>
          </apply>
        </apply>
      </math>
    </errormodel>
    <textual>
      ALA[1-3:1-2]#M(0,0) , (1,0) , (1,1) , (2,1) , (2,2) , (3,2)
    </textual>
  </group>
```

4.2 Scrambling reactions: Conventional vs. variant formulation

The following two listings show the formulation of the symmetric succinate dehydrogenase reaction step in the tricarboxylic acid cycle, first with using the dedicated `<variant/>` modeling elements and second in the traditional way by specification of two reactions, whose fluxes are explicitly equitized.

a) Formulation via `variant` elements:

```
<reaction bidirectional="true" id="TCA7_v26_1 TCA7_v26_2">
  <annotation name="pathway">TCA</annotation>
  <reduct cfg="C#1@1 C#2@1 C#3@1 C#4@1" id="Suc"/>
  <rproductid="Fum">
    <variant cfg="C#1@1 C#2@1 C#3@1 C#4@1" ratio="0.5"/>
    <variant cfg="C#2@1 C#1@1 C#4@1 C#3@1" ratio="0.5"/>
  </rproduct>
  <rproduct cfg="" id="FADH2"/>
</reaction>
```

b) Explicit formulation:

```
<reaction bidirectional="true" id="TCA7_v26_1">
  <annotation name="pathway">TCA</annotation>
  <reduct cfg="C#1@1 C#2@1 C#3@1 C#4@1" id="Suc"/>
  <rproduct cfg="C#1@1 C#2@1 C#3@1 C#4@1" id="Fum"/>
  <rproduct cfg="" id="FADH2"/>
</reaction>

<reaction bidirectional="true" id="TCA7_v26_2">
  <annotation name="pathway">TCA</annotation>
  <reduct cfg="C#1@1 C#2@1 C#3@1 C#4@1" id="Suc"/>
  <rproduct cfg="C#2@1 C#1@1 C#4@1 C#3@1" id="Fum"/>
  <rproduct cfg="" id="FADH2"/>
</reaction>

<constraints>
  <net>
    <textual>
      TCA7_v26_1=TCA7_v26_2;
    </textual>
  </net>
  <xch>
    <textual>
      TCA7_v26_1=TCA7_v26_2;
    </textual>
  </xch>
</constraints>
```

4.3 Hetero-isotopic input substrates (Level 3)

The listing shows the formulation of tracers for multi-element ILEs. In this example, the C5-N2 metabolite glutamine (*GLN*) is used as tracer. Specifically, a 2:3 mixture of [¹³C₅,¹⁴N]- and [¹³C₅,¹⁵N₂]-glutamine (*GLN*) is specified, including purities and labeling costs:

```
<input pool="GLN_ext" type="isotopomer">
  <!-- element order C-N, as defined in metabolitepools -->
  <!-- InChI numbering GLN CCCCCNN, as defined in metabolitepools -->
  <!-- costs in EUR/g -->
  <label cfg="1111100" purity="0.98 0.95" cost="6218.0">0.4</label>
  <label cfg="1111111" purity="0.98 0.98" cost="3938.0">0.6</label>
</input>
```

4.4 Exchange of substances across the cell boundary

Substances are not always exclusively taken up or produced. This might be the case for CO_2 or rich media components such as amino acids. As soon as significant exchange between intracellular and extracellular metabolites is present or suspected, this exchange has to be adequately modelled to not bias the interpretation of the observed labeling patterns. The following listing shows how exchange of metabolites is modelled, with CO_2 as example:

```
<!-- exchange of unlabeled CO2 with the environment -->
<!-- specify input pool -->
<input pool="CO2_unlabeled_in" type="isotopomer">
  <label cfg="0">1.0</label>
</input>

...

<!-- specify CO2-exchange reaction with the environment -->
<reaction bidirectional="false" id="CO2_unlabeled_upt">
  <reduct cfg="C#1@1" id="CO2_unlabeled_in"/>
  <rproduct cfg="C#1@1" id="CO2_aux"/>
</reaction>
<reaction bidirectional="false" id="CO2_exchange">
  <reduct cfg="C#1@1" id="CO2"/>
  <reduct cfg="C#1@2" id="CO2_aux"/>
  <rproduct cfg="C#1@1" id="CO2_out"/>
  <rproduct cfg="C#1@2" id="CO2"/>
</reaction>
<reaction id="CO2_out">
  <reduct cfg="C#1@1" id="CO2_out"/>
</reaction>
```

4.5 Hetero-isotopic mass spectrometric data specification (Level 3)

The listings exemplify how low and high resolution measurements for the C6-N2 amino acid lysine (*LYS*), generated in a simultaneous ^{13}C - ^{15}N ILE, are formulated in FluxML:

```
<!-- InChI numbering LYS CCCCCC[N], as defined in metabolitepools -->
<group id="ms_group_LYS_1">
  <!-- MS measurement without C-N resolution -->
  <textual>LYS[1-8]#M0,1,2,3,4,5,6,7,8</textual>
</group>

...

<group id="ms_group_LYS_2">
  <!-- MS measurement with C-N resolution, e.g. Orbitrap MS -->
  <textual>LYS[1-8]#M(0,0),(0,1),(1,0),(0,2),(1,1),
    (2,0),(1,2),(2,1),(3,0),(2,2),(3,1),(4,0),
    (3,2),(4,1),(5,0),(4,2),(5,1),(6,0),(5,2),
    (6,1),(6,2)
  </textual>
</group>
```

Notice the syntactical difference between the specification of hetero-isotopic mass spectrometric measurements, as shown here, and the notation of conventional tandem mass isotopomers as defined in FluxML (Level 1-3), given in Sec. 4.7.2.2 of the main text. In case of the latter, a *pair of fragments* is specified in squared brackets, while in the former case solely the observed metabolite fragment is specified.