modular modeling framework for scientific prototyping



#### modular

- DAG workflow
- based on networkx

## lightweight

function as node

#### distributable

with graph or model

#### customizable

wrapper as modifier

#### addresses:

- different programming proficiencies
- rapid prototyping
- difficulties in unit tests

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## **Overview**

```
def func_a(x, y):
    return x + y
                                                                               define functions
def func_b(sum_xy, z):
    return math.log(sum_xy, z)
def func_c(sum_xy, log_xy):
    return sum_xy * log_xy
doc = """MModel example function
calculates the mathematical formula (x + y)\log(x + y, z)
                                                                               define graph
graph = ModelGraph(name="Example", doc=doc)
grouped_edges = [("func a", ["func b", "func c"]), ("func b", "func c")]
graph.add_grouped_edges_from(grouped_edges)
                                                                              - define nodes and edges
node objects = [
    ("func a", func_a, ["sum_xy"]),
    ("func b", func_b, ["log_xy"]),
    ("func c", func_c, ["result"]),
                                                                               link nodes to functions
graph.set_node_objects_from(node_objects)
                                                                               define model
example_func = Model(graph, handler=MemHandler)
```

```
>>> print(example_func)
Example model
  signature: x, y, z
  returns: result
  handler: MemHandler
  modifiers: none
MModel example function
Calculates the mathematical formula (x + y)log(x + y, z)
>>> example_func(5, 3, 2) # (5 + 3)log(5 + 3, 2)
24.0
>>> example_func.draw() # draw model graph
```

## MModel components

graph: outlines DAG workflow

(networkx based)

handler: handles graph execution

modifier: decorates graphs,

subgraphs, or nodes

model: creates workflow callables

```
Example model
signature: x, y, z
returns: result
handler: MemHandler
modifiers: none
MModel example function
calculates the mathematical formula (x + y)\log(x + y, z)
                     func a
                     func_a(x, y)
                     return sum_xy
                  sum_xy
            func b
                                  sum_xy
            func_b(sum_xy, z)
            return log_xy
                log_xy
                 func c
                func_c(sum_xy, log_xy)
                 return result
```

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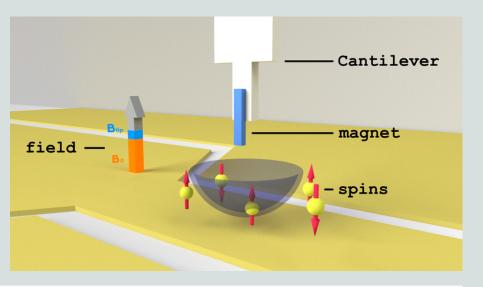




## Building scientific packages using mmodel (developer)

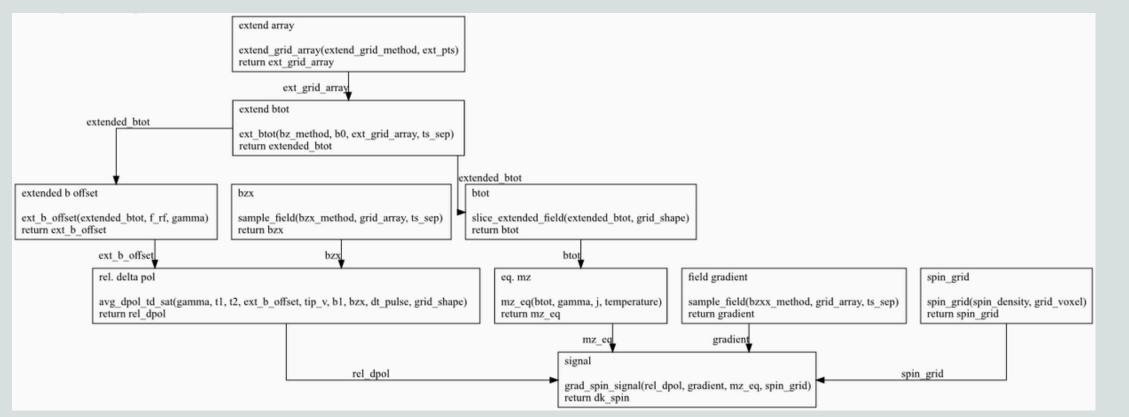
## mrfmsim

Simulate signals in Magnetic Resonance Force Microscope experiments



### Create a new experiment:

```
from mmodel import ModelGraph
                                                                               node_objects = [
from mrfmsim.function import ...
                                                                                   ("extend array", extend_grid_array, ["ext_grid_array"]),
                                                                                   ("extend btot", ext_btot, ["extended_btot"]),
grouped_edge_list = [
                                                                                   ("btot", slice_extended_field, ["btot"]),
    ("extend array", "extend btot"),
                                                                                   ("bzx", sample_field, ["bzx"], [smod(["bzx_method", "grid_array", "ts_sep"])]),
    ("extend btot", ["extended b offset", "btot"]),
                                                                                   ("field gradient", sample_field, ["gradient"]),
    ("btot", "eq. mz"),
                                                                                   ("eq. mz", mz_eq, ["mz_eq"]),
   (["bzx", "extended b offset"], "rel. delta pol"),
                                                                                   ("rel. delta pol", avg_dpol_td_sat, ["rel_dpol"]),
    (["eq. mz", "field gradient", "rel. delta pol", "spin_grid"], "signal"),
                                                                                   ("extended b offset", ext_b_offset, ["ext_b_offset"]),
                                                                                   ("spin_grid", spin_grid, ["spin_grid"]),
                                                                                   ("signal", grad_spin_signal, ["dk_spin"]),
td_esr_graph = ModelGraph(doc=doc, name = "td_esr")
td_esr_graph.add_grouped_edges_from(grouped_edge_list)
                                                                               td_esr_graph.set_node_objects_from(node_objects)
                                                                               ts_esr_model = Model(td_esr_model, handler=MemHandler, modifiers=[])
```



## Developer role

- 1. define functions
- 2. define experiment graphs with functions
- 3. define default models
- 4. test functions and models
- 5. define shortcuts and additional modifiers

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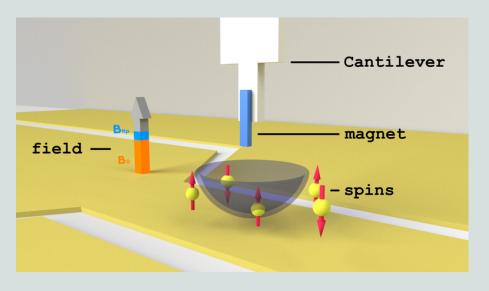




## Building scientific packages using mmodel (developer)

## mrfmsim

Simulate signals in Magnetic Resonance Force Microscope experiments



### Create a package-specific shortcut:

```
subgraph = subgraph_by_parameters(graph, ["b0"])
loop_node = Model(subgraph, MemHandler, [loop_modifier("b0")])
looped_graph = modify_subgraph(graph, subgraph, "b0 loop node", loop_node)
looped_model = Model(looped_graph, handler=MemHandler)
```



```
looped_model = loop_shortcut(td_esr_model, "b0")
```

```
mrfmsim
```

```
from mmodel import Model, subgraph_by_parameters, modify_subgraph, loop_modifier

def loop_shortcut(model, loop_parameter: str):
    """Shortcut to add loop to subgraph of the given model

    :return: a new model that loops the parameter in the subgraph
    """
    loop_mod = loop_modifier(loop_parameter)
    handler = model._handler
    graph = model._graph
    model_modifiers = model._modifiers
    node_name = f"{loop_parameter} loop node"

subgraph = subgraph_by_parameters(graph, [loop_parameter])
    loopee_node = Model(subgraph, handler, loop_mod)
    looped_graph = modify_subgraph(graph, subgraph, node_name, loop_node)
    looped_model = Model(looped_graph, handler)
    mrfmsim
    return looped_model
```

## Modify a subgraph in mmodel

- 1. find the subgraph
- 2. create a "function" (model) base on subgraph
- 3. substitute graph with a "submodel"
- 4. create a new model based on the new graph

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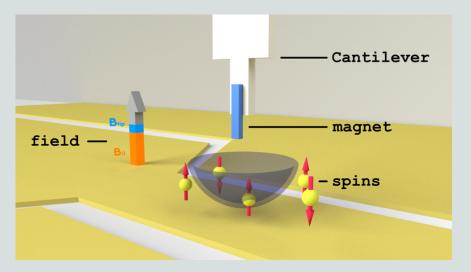




## Building scientific packages using mmodel (user)

## mrfmsim

Simulate signals in Magnetic Resonance Force Microscope experiments



## Create a loop in model and execute the model:

```
from mmodel import draw plain graph
from mrfmsim.shortcut import loop shortcut
from mrfmsim.experiment import td esr model
td esr model.draw(method=draw plain graph)
td esr bl looped model = loop shortcut(td esr model, "bl")
dk spin td blloop = td esr bl looped model(
    dt pulse=5.44e-4,
    grid=grid,
    magnet=magnet,
    sample=sample,
    ts sep=[0, 150.0, 0],
    b1=b1 list,
    f rf=18.1e9,
    b0=645,
    ext_pts=[x_pts, 0, 0],
    tip v=tip v,
```

#### User role

- 1. Inspect model graph
- 2. Modify model or subgraph using modifiers
- 3. Execute model as a function

