# Contributing to PyMC

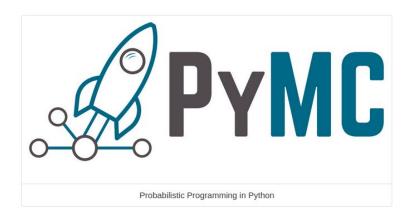
A testimonial by Ricardo Vieira

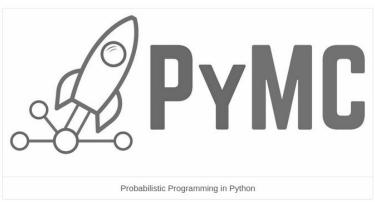


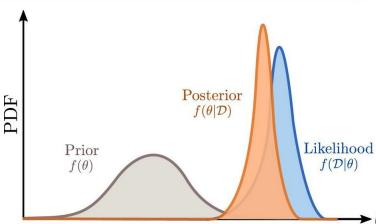
Slides at tinyurl.com/contributing-pymc

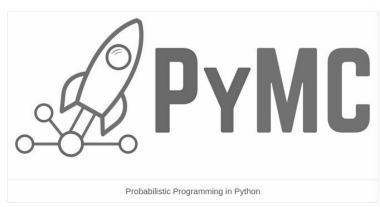
# My intentions

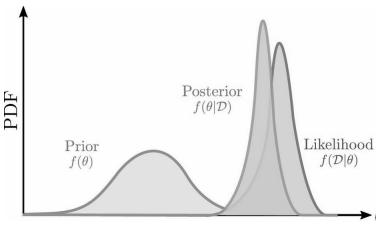
- Illustrate the Open Source collaboration experience
  - What it looks like when you are just starting
  - What it looks like for a regular contributor
- Share my biased views
  - It feels very random, you are unlikely to know where it leads
  - It is a great opportunity to learn
  - A lot of fun (hopefully)
- Invite you to give it a try!









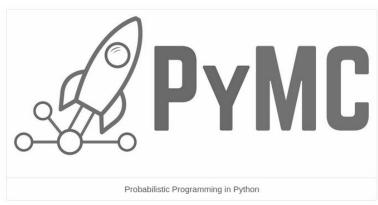


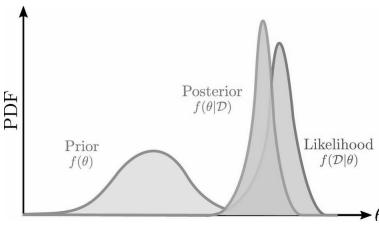
```
import pymc as pm
import pandas as pd

obs_data = pd.read_csv("my_observed_data.csv")

with pm.Model() as m:
    mean = pm.Normal("mean", 0, 1)
    noise = pm.HalfNormal("noise", 1)
    data = pm.Normal("data", mean, noise, observed=obs_data)

posterior = pm.sample()
```





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Learn more at: docs.pymc.io/en/latest

<u>Austin Rochford: Intro to Probabilistic Programming with PyMC</u>

PyMC timeline	Personal timeline

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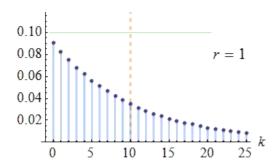
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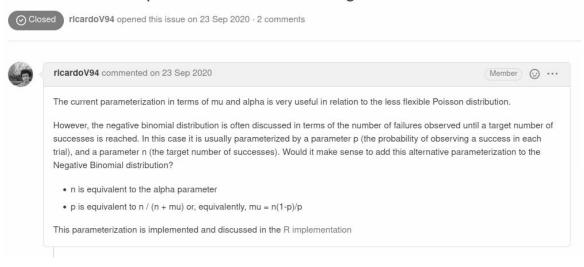
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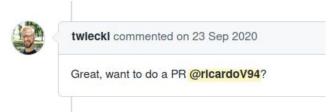
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2020	PyMC developers decide to maintain Theano	First contributions to PyMC

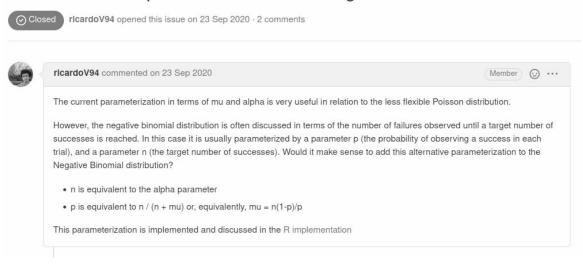
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2020	PyMC developers decide to fork Theano	First contributions to PyMC
2021	PyMC v4 beta is released	Becomes core developer Participates in Google Summer of Code Quits PhD Gets financial support from Chan Zuckerberg Initiative (Via NumFocus)

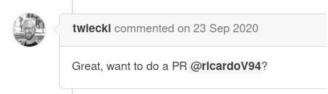


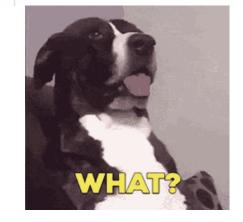


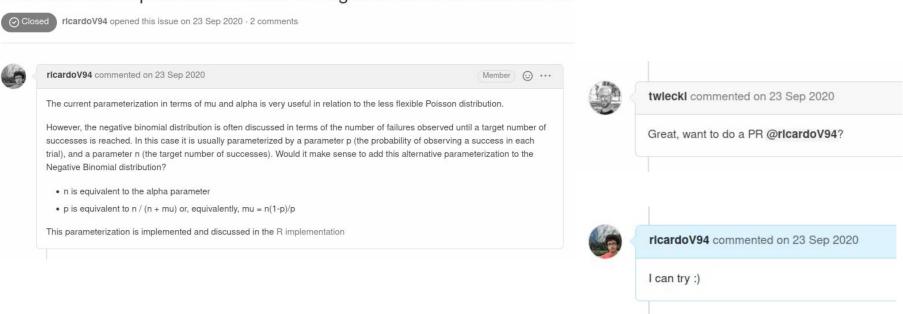


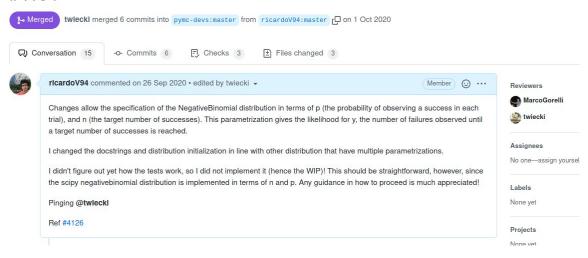








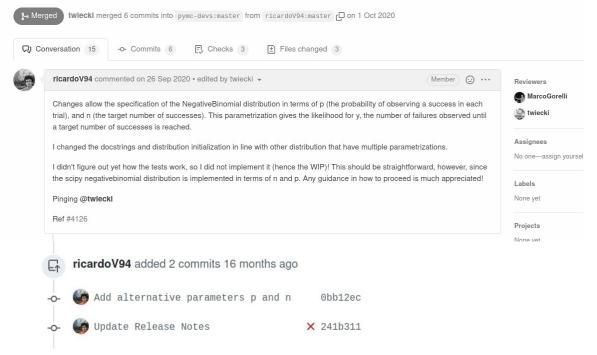




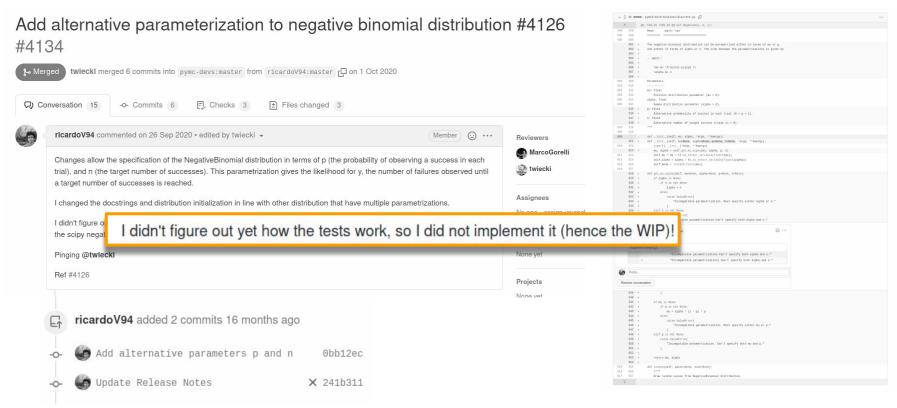
Add alternative parameterization to negative binomial distribution #4126 #4134 twleckI merged 6 commits into pymc-devs:master from ricardoV94:master p on 1 Oct 2020 Conversation 15 -o- Commits 6 F, Checks 3 ± Files changed 3 rlcardoV94 commented on 26 Sep 2020 • edited by twiecki 🕶 Member 🛈 ··· Reviewers MarcoGorelli Changes allow the specification of the NegativeBinomial distribution in terms of p (the probability of observing a success in each twiecki trial), and n (the target number of successes). This parametrization gives the likelihood for y, the number of failures observed until a target number of successes is reached. Assignees I changed the docstrings and distribution initialization in line with other distribution that have multiple parametrizations. No one-assign yoursel I didn't figure out yet how the tests work, so I did not implement it (hence the WIP)! This should be straightforward, however, since the scipy negativebinomial distribution is implemented in terms of n and p. Any guidance in how to proceed is much appreciated! Labels Pinging @twleckl None yet Ref #4126 Projects

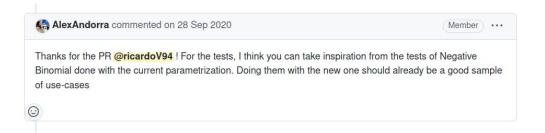


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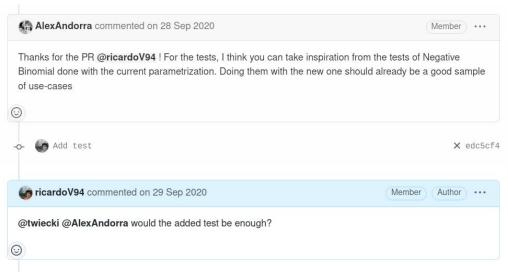




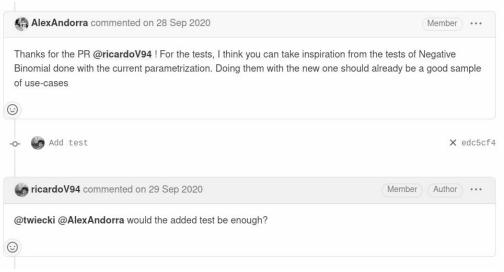




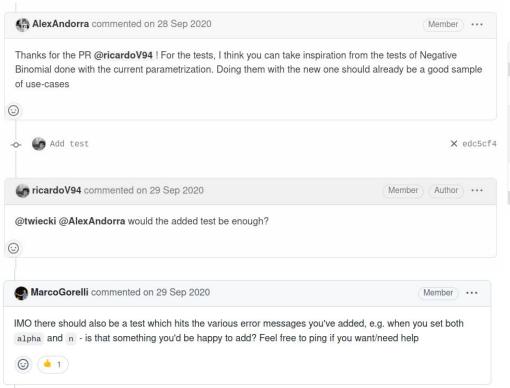




```
@@ -795,6 +795,12 @@ def test_fun(value, mu, alpha):
795
     795
                      return sp.nbinom.logpmf(value, alpha, 1 - mu / (mu + alpha))
796
797
     797
                   self.pymc3_matches_scipy(NegativeBinomial, Nat, {"mu": Rplus, "alpha": Rplus}, test_fun)
     798 +
                   self.pymc3_matches_scipy(
                      NegativeBinomial,
                      {"p": Unit, "n": Rplus},
                      lambda value, p, n: sp.nbinom.logpmf(value, n, p),
     803 +
798
799
     805
               def test laplace(self):
     806
                   self.pymc3_matches_scipy(
```

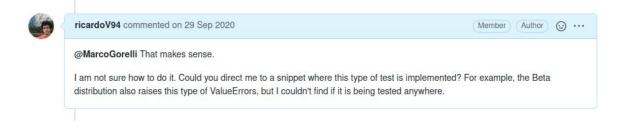


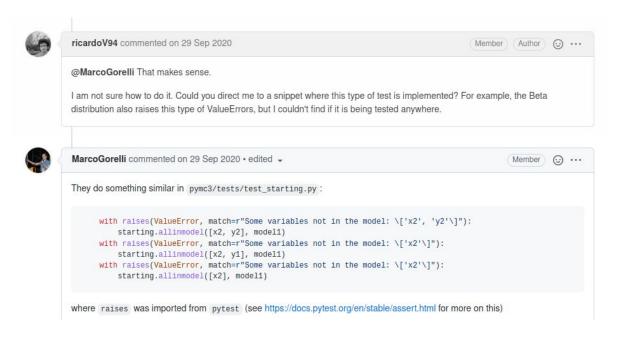


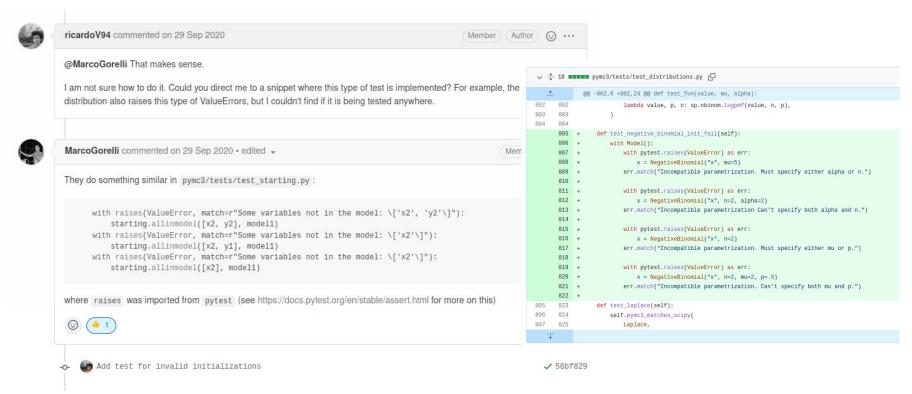


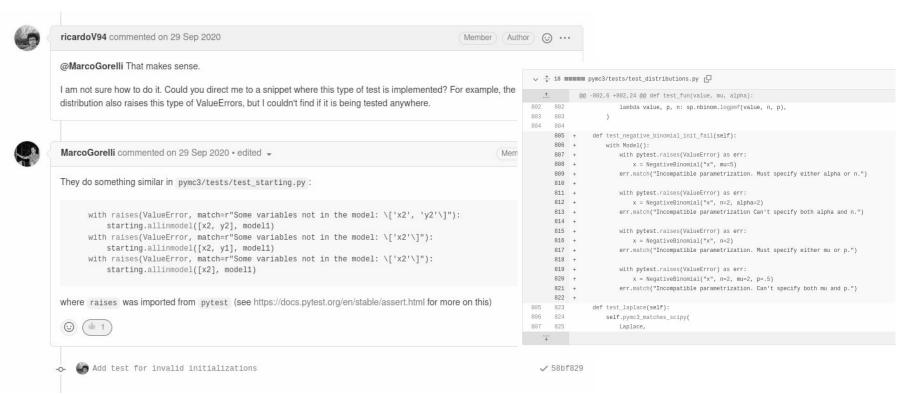












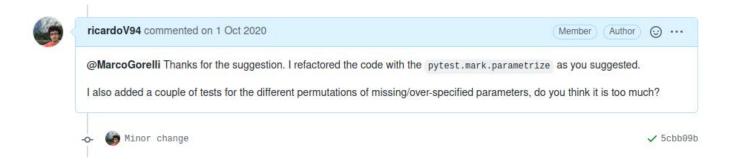




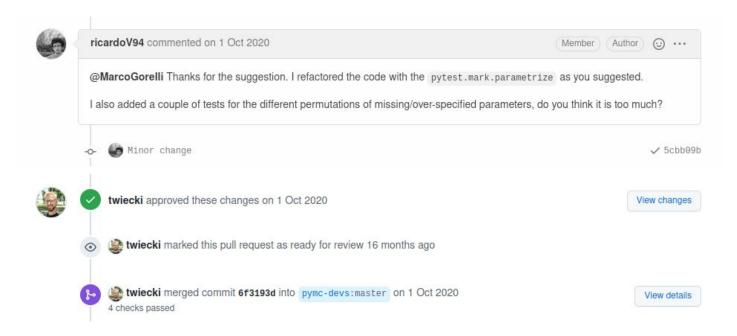


```
def test_negative_binomial_init_fail(self):
                  @pytest.mark.parametrize(
       806 +
                      "mu, p, alpha, n, expected".
       808 +
                          (5, None, None, None, "Incompatible parametrization. Must specify either alpha or n."),
       809 +
                          (None, .5, None, None, "Incompatible parametrization. Must specify either alpha or n."),
       810 +
                          (None, None, None, "Incompatible parametrization, Must specify either alpha or n."),
       811 +
                          (5, None, 2, 2, "Incompatible parametrization. Can't specify both alpha and n."),
       812 +
                          (None, .5, 2, 2, "Incompatible parametrization. Can't specify both alpha and n."),
       813 +
                          (5, .5, 2, 2, "Incompatible parametrization. Can't specify both alpha and n."),
                          (None, None, 2, None, "Incompatible parametrization. Must specify either mu or p."),
       814 +
       815 +
                          (None, None, None, 2, "Incompatible parametrization, Must specify either mu or p."),
       816 +
                          (5, .5, 2, None, "Incompatible parametrization. Can't specify both mu and p."),
       817 +
                          (5, .5, None, 2, "Incompatible parametrization, Can't specify both mu and p."),
       819 +
       820 +
                  def test_negative_binomial_init_fail(self, mu, p, alpha, n, expected):
                      with Model():
896
      821
807
                          with pytest.raises(ValueError) as err:
                              x = NegativeBinomial("x", mu=5)
                          err.match("Incompatible parametrization. Must specify either alpha or n.")
811
                          with pytest.raises(ValueError) as err:
                              x = NegativeBinomial("x", n=2, alpha=2)
813
                          err.match("Incompatible parametrization Can't specify both alpha and n.")
814
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816
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817
                          err.match("Incompatible parametrization. Must specify either mu or p.")
                          with pytest.raises(ValueError) as err:
                              x = NegativeBinomial("x", n=2, mu=2, p=.5)
                          err.match("Incompatible parametrization. Can't specify both mu and p.")
       822 +
                          with pytest.raises(ValueError, match=expected):
                              NegativeBinomial("x", mu=mu, p=p, alpha=alpha, n=n)
       823 +
822
```

### What does a (first) PR look like?



## What does a (first) PR look like?



### What was it like?

- More work than expected
- Learned many new concepts:
  - unittesting
  - parametrizing
  - monkey-patching
  - code style checks
- There is a whole community to support and challenge you
- It was fun?



### I came back for more

26 Sep - 01 Oct

Add alternative parameterization to negative binomial distribution #4126 
#4134 by ricardoV94 was merged on 1 Oct 2020 • Approved

### I came back for more

16 Nov - 27 Feb

26 Sep - 01 Oct

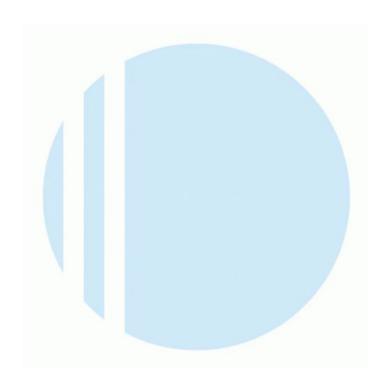
WIP: Add tt.nnet.softmax to math (#4226) x

#4229 by ricardoV94 was closed on 27 Feb 2021 • Changes requested

🕽 🦒 Add alternative parameterization to negative binomial distribution #4126 🗸

#4134 by ricardoV94 was merged on 1 Oct 2020 • Approved

### I came back for more











### Organizations

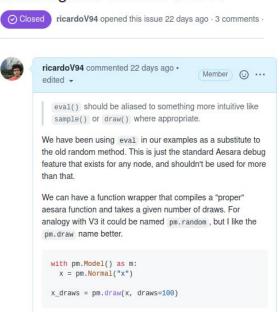




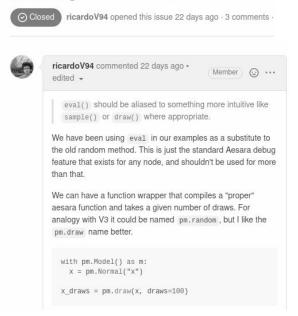


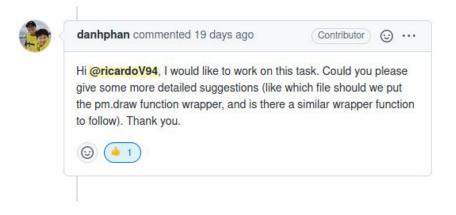


Create helper pm.draw() to take draws from a given variable #5311



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```
2100 + **kwargs
                           2101 + ) -> Dict[str, np.ndarray]:
                          2102 + """Draw samples for one variable or a list of variables
      2119 +
                 if vars is None:
                     raise AssertionError("Must include at least one variable")
      2120 +
This conversation was marked as resolved by danhphan
                                                                          - Show conversation
      2121 +
      2122 +
                if isinstance(vars, tuple):
      2123 +
                     vars = list(vars)
      2124 +
                 elif not isinstance(vars, list):
                     vars = [vars]
      2125 +
This conversation was marked as resolved by ricardoV94
                                                                          - Show conversation
      2126 +
      2127 +
                  draw_fn = compile_pymc(inputs=[], outputs=vars, mode=mode, **kwargs)
      2128 +
      2129 +
                  values = zip(*(draw_fn() for _ in range(draws)))
      2130 +
                  names = [var.name for var in vars]
      2131 +
      2132 +
                  drawn_data = {k: np.stack(v) for k, v in zip(names, values)}
      2133 +
      2134 +
                if drawn_data is None:
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                     raise AssertionError("No variables drawed")
This conversation was marked as resolved by ricardoV94
                                                                          - Show conversation
      2136 +
      2137 +
                  return drawn data
      2138 +
```

2096 + def draw(

2099 + mode=None.

```
2096 + def draw(
2097 + vars,
2098 + draws=500,
2099 + mode=None,
2100 + **kwargs
2101 + ) -> Dict[str, np.ndarray]:
2102 + """Draw samples for one variable or a list of variables
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2144 2144

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2147 - 2148 2145 if not isinstance(vars, (list, tuple)):
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1266 - npt.assert_raises(AssertionError, assert_array_equal, x_draws_1, x_draws_2)

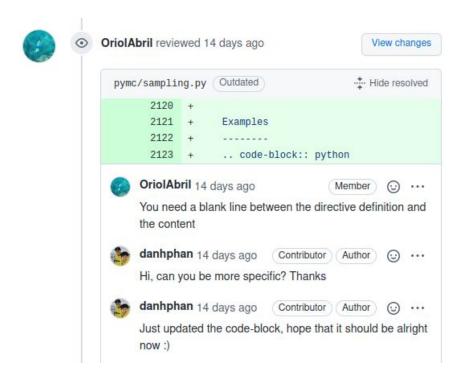
1258 + assert not np.all(np.isclose(x_draws_1, x_draws_2))
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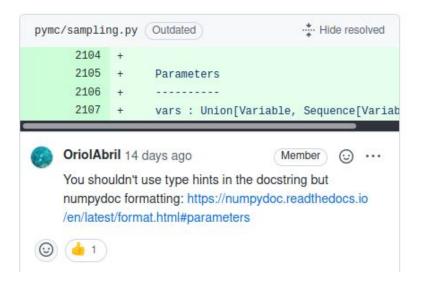
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1266
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```
pymc.sampling.draw(vars, draws=1, mode=None, **kwargs)

Draw samples for one variable or a list of variables

Parameters: vars

A variable or a list of variables for which to draw samples.

draws: int

Number of samples needed to draw. Detaults to 500.

mode

The mode used by aesara.function to compile the graph.

**kwargs

Keyword arguments for pymc.aesara.compile_pymc()

Returns: List[np.ndarray]

A list of numpy arrays.
```

#### Examples

```
import pymc as pm
# Draw samples for one variable
with pm.Model():
    x = pm.Normal("x")
x draws = pm.draw(x, draws=100)
print(x_draws.shape)
# Draw 1000 samples for several variables
with pm.Model():
    x = pm.Normal("x")
    y = pm.Normal("y", shape=10)
    z = pm.Uniform("z", shape=5)
num draws = 1000
# Draw samples of a list variables
draws = pm.draw([x, y, z], draws=num_draws)
assert draws[0].shape == (num_draws,)
assert draws[1].shape == (num_draws, 10)
assert draws[2].shape == (num_draws, 5)
```

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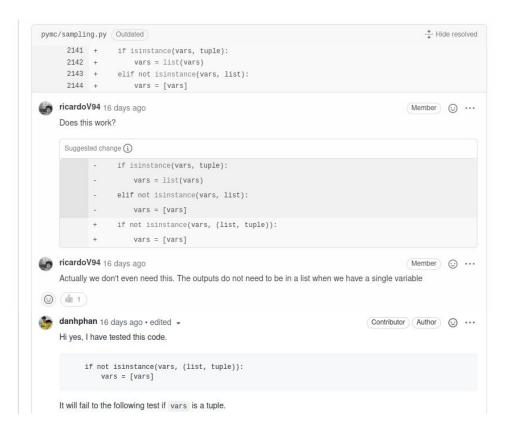
A list of numpy arrays.
```

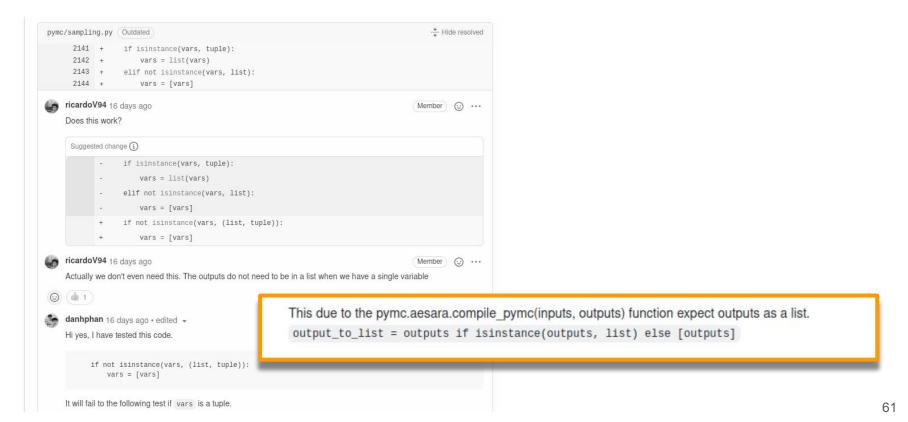
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```

```
Hide resolved
pymc/sampling.py Outdated
                if isinstance(vars, tuple):
      2142 +
                     vars = list(vars)
      2143 + elif not isinstance(vars, list):
      2144 +
                     vars = [vars]
    ricardoV94 16 days ago
    Does this work?
     Suggested change (i)
                 if isinstance(vars, tuple):
                     vars = list(vars)
                 elif not isinstance(vars, list):
                     vars = [vars]
                 if not isinstance(vars, (list, tuple)):
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```







```
y - 2 ■■ □□ pymc/aesaraf.py [□
   1
              00 -967,7 +967,7 00 def compile pymc(inputs, outputs, mode=None, **kwarqs):
967
      967
                  # Set the default update of a NoDistribution RNG so that it is automatically
968
      968
969
      969
                  # updated after every function call
                  output_to_list = outputs if isinstance(outputs, list) else [outputs]
970
      970 +
                  output_to_list = outputs if isinstance(outputs, (list, tuple)) else [outputs]
971
      971
                  for rv in (
972
      972
                      node
      973
                     for node in walk_model(output_to_list, walk_past_rvs=True)
973
```

```
2141 - if isinstance(vars, tuple):
2142 - vars = list(vars)
2143 - elif not isinstance(vars, list):
2144 + if not isinstance(vars, (list, tuple)):
2144 2149 vars = [vars]
```



#### Change internal variable names



#### Fix type hints

icardoV94 committed 14 days ago

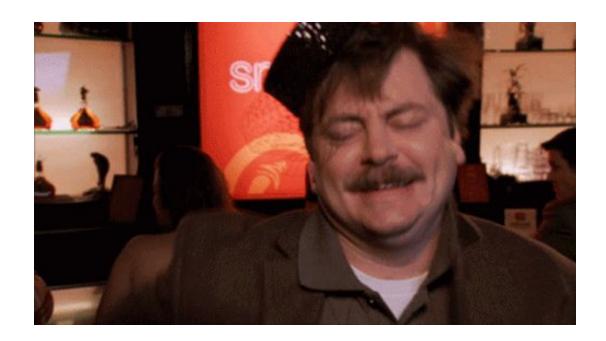
#### Return scalar variables instead of 1D

icardoV94 committed 14 days ago

```
2145
2145
                  if not isinstance(vars, (list, tuple)):
2146
2147
                      vars = [vars]
2148
2149
      2146
                   draw_fn = compile_pymc(inputs=[], outputs=vars, mode=mode, **kwargs)
2150
                   drawn_values = zip(*(draw_fn() for _ in range(draws)))
2151
                   drawn_values = [np.stack(v) for v in drawn_values]
2152
      2147
2153
                  # If only one variable, return the numpy array instead of a list of numpy arrays
                  if draws == 1:
2154
      2148
2155
                      return drawn_values[0]
2156
                   return drawn_values
      2149 +
                       return draw_fn()
      2150 +
      2151 +
                   # Single variable output
      2152 +
                  if not isinstance(vars, (list, tuple)):
       2153 +
                       drawn_values = (draw_fn() for _ in range(draws))
      2154 +
                      return np.stack(drawn_values)
       2155 +
      2156 +
                   # Multiple variable output
       2157 +
                   drawn_values = zip(*(draw_fn() for _ in range(draws)))
       2158 +
                   return [np.stack(v) for v in drawn_values]
2157
      2159
```

### What is it like?

### What is it like?



### What is it like?

# Still figuring it out

### So you want to be an OSS contributor?

- Find a project you care about
- Engage with the community
- Be open to challenges
- Be ready to
  - learn
  - be wrong
  - make your case
- Take responsibility seriously
  - Your code will be used by many others
- Be patient
- Be polite

# Thank you!