

vcirc_test-pymc3

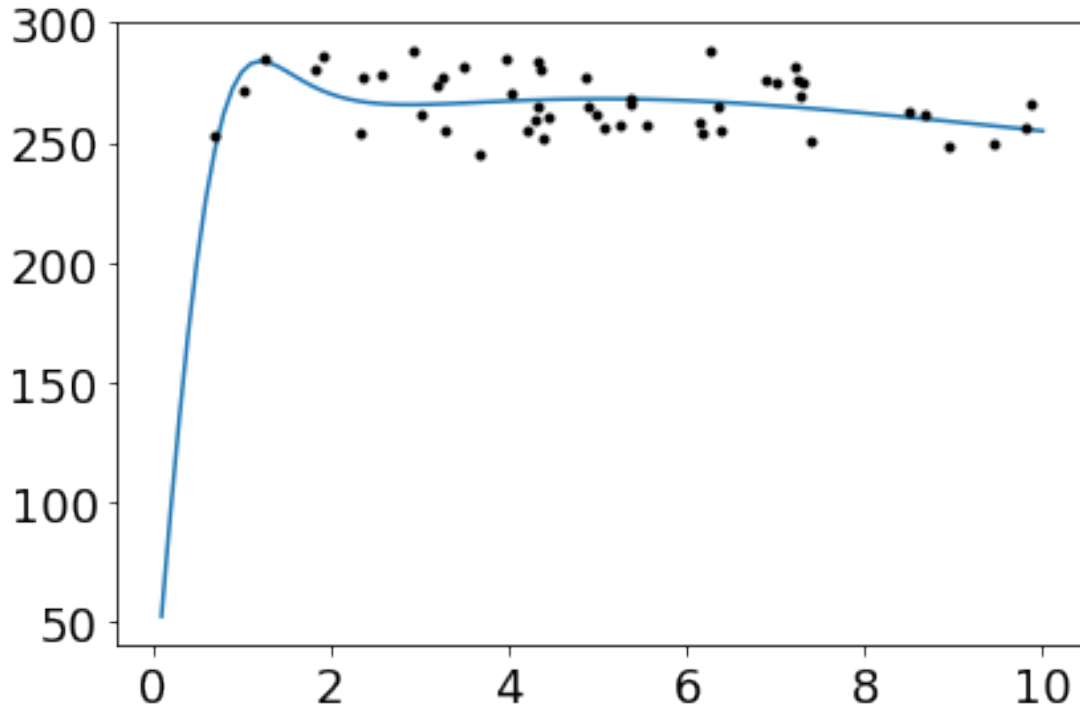
August 3, 2018

```
In [1]: import numpy as np
import galpy
import galpy.dynamics.dynamic_component as dc
import matplotlib.pyplot as plt
from galpy.dynamics import galpotential
from scipy import interpolate
import warnings
warnings.filterwarnings("ignore")
import seaborn as sns
from matplotlib.ticker import AutoMinorLocator
from matplotlib import colors
from matplotlib.colors import ListedColormap
from matplotlib.ticker import AutoMinorLocator
from matplotlib.ticker import MaxNLocator, MultipleLocator
cm = 'plasma'

In [2]: #Generate some data
def rot_curve(distance, Mbulge, Rbulge, Mdisc, Rdisc, Zdisc, Denshalo, Rhalo):
    halo=dc.NFW_halo(d0=Denshalo, rs=Rhalo, mcut=100., e=0.) #Halo
    bulge=dc.valy_halo(mass=Mbulge, rb=Rbulge, mcut=3., e=0.) #Bulge
    disc=dc.Exponential_disc.thick(sigma0=Mdisc/(2*np.pi*Rdisc**2.), Rd=Rdisc, zd=Zdisc)
    MW=galpotential(dynamic_components=(halo,disc,bulge))
    vgrid=MW.vcirc(distance, show_comp=True, nproc=1)
    return vgrid[:, -1]

dist=np.linspace(0.1,10,100)
np.random.seed(123)
d_GC = np.random.uniform(0.1,10,50)
v_rot = rot_curve(d_GC, 2e10, 0.5, 5e10, 2.5, 0.3, 3e7, 10)
v_obs = np.random.normal(v_rot, 10) #dispersion around rotation curve

plt.plot(dist, rot_curve(dist, 2e10, 0.5, 5e10, 2.5, 0.3, 3e7, 10))
plt.plot(d_GC, v_obs, 'k.')
plt.show()
```



In [5]: *#Working with theano variables*

```
import time
import theano.tensor as tt
from theano.compile.ops import as_op

#####THEANO VERSION#####

#Declaring function ready to work with theano variables using the decarator as_op to u
@as_op(itypes=[tt.dvector,tt.dscalar,tt.dscalar,tt.dscalar,tt.dscalar,tt.dscalar,tt.dscalar])
def rot_curve_theano(distance,Mbulge,Rbulge,Mdisc,Rdisc,Zdisc,Denshalo,Rhalo):
    halo=dc.NFW_halo(d0=Denshalo, rs=Rhalo, mcut=100., e=0.) #Halo
    bulge=dc.valy_halo(mass=Mbulge, rb=Rbulge, mcut=3., e=0.) #Bulge
    disc=dc.Exponential_disc.thick(sigma0=Mdisc/(2*np.pi*Rdisc**2.),Rd=Rdisc, zd=Zdisc)
    MW=galpotential(dynamic_components=(halo,disc,bulge))
    vgrid=MW.vcirc(distance,show_comp=True,nproc=1)
    return vgrid[:,-1]

#Variables using _shared theano tensor to pass from pure python variables to theano te
distance=tt._shared(d_GC)
Mbulge=tt._shared(np.cast['float64'](2.0e10))
Rbulge=tt._shared(np.cast['float64'](0.5))
Dhalo = tt._shared(np.cast['float64'](3e7))
Rhalo = tt._shared(np.cast['float64'](10))
Mdisc = tt._shared(np.cast['float64'](5e10))
```

```

Rdisc = tt._shared(np.cast['float64'](2.5))
Zdisc = tt._shared(np.cast['float64'](0.3))

#timing
t1=time.time()
v_rot_theano = rot_curve_theano(distance,Mbulge,Rbulge,Mdisc,Rdisc,Zdisc,Dhalo,Rhalo)
t2a=time.time()
v_rot=v_rot_theano.eval()
t2b=time.time()
print('Theano version time (estimating vrot)',t2a-t1)
print('Theano version time (estimating vrot+cast to numpy array)',t2b-t1)

###STANDARD VERSION
#timing
t1=time.time()
v_rot = rot_curve(d_GC,2.0e10,0.5,5e10,2.5,0.3,3e7,10)
t2=time.time()
print('Standard version time (estimating vrot)',t2-t1)

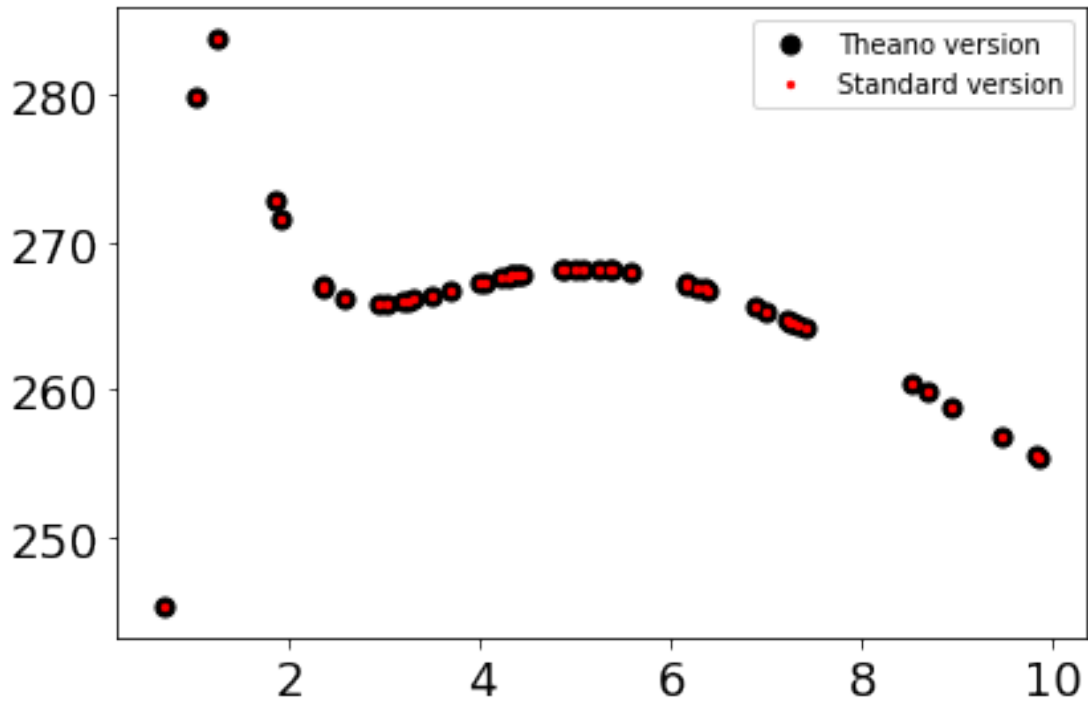
#Comparative plot
plt.scatter(d_GC,v_rot,label='Theano version',c='black',s=50) #THEANO
plt.scatter(d_GC,v_rot,s=5,label='Standard version',c='red') #STANDARD
plt.legend()
plt.show()

```

```

Theano version time (estimating vrot) 0.00011873245239257812
Theano version time (estimating vrot+cast to numpy array) 0.5320971012115479
Standard version time (estimating vrot) 0.6339089870452881

```



In [6]: #PYMC3#

```
import pymc3 as pm
import corner
```

```
RC_model = pm.Model()
```

```
with RC_model as model_deterministic:
```

```
    # Priors for unknown model parameters
```

```
    Dhalo = pm.Uniform('Dhalo', lower=1e+6, upper=1e+8)
```

```
    Rhalo = pm.Uniform('Rhalo', lower=1., upper=50.)
```

```
    Mdisc = pm.Uniform('Mdisc', lower=1e+10, upper=1e+12) #pm.Normal('Mdisc', mu=1e+10,
```

```
    Rdisc = pm.Normal('Rdisc', mu=2.5, sd=0.1) #pm.Uniform('Rdisc', lower=1., upper=10.)
```

```
    Zdisc = pm.Normal('Zdisc', mu=0.3, sd=0.1) #pm.Uniform('Hdisc', lower=0.05, upper=0.
```

```
    #Constant parameters
```

```
    distance=tt._shared(d_GC)
```

```
    Mbulge=tt._shared(np.cast['float64'](2.0e10))
```

```
    Rbulge=tt._shared(np.cast['float64'](0.5))
```

```
    # Expected value of outcome (model)
```

```
    v_rot = rot_curve_theano(distance, Mbulge, Rbulge, Mdisc, Rdisc, Zdisc, Dhalo, Rhalo)
```

```
    # Likelihood (sampling distribution) of observations
```

```
v_fit = pm.Normal('v_fit', mu=v_rot, sd=10, observed=v_obs)
```

```
with RC_model:
```

```

    #Number of threads
    nproc=4
    #Number of burn-in samples
    Nburn=10
    # Number of posterios samples
    Npost=10
    # instantiate sampler
    step = pm.Metropolis()
    # draw posterior samples
    trace = pm.sample(draws=Npost,step=step,njobs=nproc,tune=Nburn)

```

Only 10 samples in chain.

Multiprocess sampling (4 chains in 4 jobs)

CompoundStep

>Metropolis: [Zdisc]

>Metropolis: [Rdisc]

>Metropolis: [Mdisc]

>Metropolis: [Rhalo]

>Metropolis: [Dhalo]

Sampling 4 chains: 100%|| 80/80 [01:26<00:00, 3.28s/draws]

In [7]: pt=pm.plot_posterior(trace)

