## log\_gaussian\_cox\_model

December 8, 2017

## 0.1 Log Gaussian Cox process

This notebook implements the log gaussian cox process up dimension 64<sup>2</sup>

```
In [1]: import numpy as np
        import numexpr as ne
        from numba import jit
        from matplotlib import pyplot as plt
        import sys
        sys.path.append("/home/alex/Dropbox/smc_hmc/python_smchmc/")
        \#sys.path.append("/home/alex/Dropbox/smc_hmc/python_smchmc/smc_sampler_functions")
   Load the data
In [2]: dim = 400
        \verb|from smc_sampler_functions.target_distributions_logcox import f_dict_log_cox|\\
        parameters_log_cox = f_dict_log_cox(int(dim**0.5))
   Defining the sampler parameters
In [3]: N_particles = 2**10
        T_{time} = 40
        move_steps_hmc = 1
        move_steps_rw_mala = 1
        ESStarget = 0.8
        M_num_repetions = 1
        epsilon = 1.
        epsilon_hmc = .1
        verbose = False
        parameters = {'dim' : dim,
                      'N_particles' : N_particles,
                      'T_time' : T_time,
                      'autotempering' : True,
                      'ESStarget': ESStarget,
                       'adaptive_covariance' : True
        from smc_sampler_functions.functions_smc_help import sequence_distributions
        from smc_sampler_functions.proposal_kernels import proposalmala, proposalrw, proposalhmo
```

```
from smc_sampler_functions.functions_smc_main import smc_sampler
maladict = {'proposalkernel_tune': proposalmala,
                                                                                'proposalkernel_sample': proposalmala,
                                                                                'proposalname' : 'MALA',
                                                                                'target_probability' : 0.65,
                                                                                'covariance_matrix' : np.eye(dim),
                                                                                'L_steps' : 1,
                                                                               'epsilon' : np.array([epsilon]),
                                                                                'epsilon_max' : np.array([epsilon]),
                                                                                'tune_kernel': True,
                                                                                'sample_eps_L' : True,
                                                                                'verbose' : verbose,
                                                                                'move_steps': move_steps_rw_mala
hmcdict = {'proposalkernel_tune': proposalhmc,
                                                                                'proposalkernel_sample': proposalhmc_parallel,
                                                                                'proposalname' : 'HMC',
                                                                                'target_probability' : 0.9,
                                                                                'covariance_matrix' : np.eye(dim),
                                                                                'L_steps' : 20,
                                                                                'epsilon' : np.array([epsilon_hmc]),
                                                                                'epsilon_max' : np.array([epsilon_hmc]),
                                                                                'accept_reject' : True,
                                                                                'tune_kernel': True,
                                                                                'sample_eps_L' : True,
                                                                                'parallelize' : False,
                                                                                'verbose' : verbose,
                                                                                'move_steps': move_steps_hmc,
                                                                               'mean_L' : False
                                                                               }
from smc_sampler_functions.functions_smc_main import repeat_sampling
from smc_sampler_functions.target_distributions_logcox import priorlogdens_log_cox, priorlog_cox, 
from smc_sampler_functions.target_distributions_logcox import targetlogdens_log_cox, targetlog_cox, targetlog_co
parameters.update(parameters_log_cox)
priordistribution = {'logdensity' : priorlogdens_log_cox, 'gradlogdensity' : priorgradlog
targetdistribution = {'logdensity' : targetlogdens_log_cox, 'gradlogdensity' : targetgra
samplers_list_dict = [maladict, hmcdict]
temperedist = sequence_distributions(parameters, priordistribution, targetdistribution)
res_repeated_sampling, res_first_iteration = repeat_sampling(samplers_list_dict, tempere
```

The minimum supported version is 2.4.6

/usr/local/lib/python2.7/dist-packages/pandas/core/computation/\_\_init\_\_.py:18: UserWarning: The

## ver=ver, min\_ver=\_MIN\_NUMEXPR\_VERSION), UserWarning)

```
repetition 0 of 1
Now runing smc sampler with MALA kernel
now tuning
now sampling
now tuninge 0.0080109834671
now sampling
now tuninge 0.0158061299308
now sampling
now tuninge 0.0235310460066
now sampling
now tuninge 0.0313952826493
now sampling
now tuninge 0.0399397015182
now sampling
now tuninge 0.0499947687765
now sampling
now tuninge 0.06279150348
now sampling
now tuninge 0.0787975247466
now sampling
now tuninge 0.0965034705594
now sampling
now tuninge 0.114193615453
now sampling
now tuninge 0.131945101026
now sampling
now tuninge 0.150522902731
now sampling
now tuninge 0.170209737964
now sampling
now tuninge 0.191192769898
now sampling
now tuninge 0.212615641207
now sampling
now tuninge 0.233477186207
now sampling
now tuninge 0.254056393444
now sampling
now tuninge 0.273830914008
now sampling
now tuninge 0.293695496865
now sampling
now tuninge 0.314335219423
now sampling
```

```
now tuninge 0.335001675342
```

- now sampling
- now tuninge 0.355594676564
- now sampling
- now tuninge 0.375282490267
- now sampling
- now tuninge 0.394136227187
- now sampling
- now tuninge 0.411868014034
- now sampling
- now tuninge 0.429109100151
- now sampling
- now tuninge 0.445029867378
- now sampling
- now tuninge 0.460472108627
- now sampling
- now tuninge 0.475321621095
- now sampling
- now tuninge 0.490232340187
- now sampling
- now tuninge 0.505489987815
- now sampling
- now tuninge 0.520760798016
- now sampling
- now tuninge 0.536103053481
- now sampling
- now tuninge 0.551429456043
- now sampling
- now tuninge 0.567031178782
- now sampling
- now tuninge 0.582994946866
- now sampling
- now tuninge 0.599195721394
- now sampling
- now tuninge 0.615609922877
- now sampling
- now tuninge 0.632075545683
- now sampling
- now tuninge 0.648602086228
- now sampling
- now tuninge 0.666011526861
- now sampling
- now tuninge 0.682755208348
- now sampling
- now tuninge 0.699368281823
- now sampling
- now tuninge 0.715631465319
- now sampling

```
now tuninge 0.732178833079
now sampling
now tuninge 0.749617235418
now sampling
now tuninge 0.767356589335
now sampling
now tuninge 0.784053950596
now sampling
now tuninge 0.800264793923
now sampling
now tuninge 0.815809724029
now sampling
now tuninge 0.831181602792
now sampling
now tuninge 0.846606557596
now sampling
now tuninge 0.862100000969
now sampling
now tuninge 0.877172949987
now sampling
now tuninge 0.891933969415
now sampling
now tuninge 0.906947205466
now sampling
now tuninge 0.922688094623
now sampling
now tuninge 0.939202740914
now sampling
now tuninge 0.955723321803
now sampling
now tuninge 0.971462466158
now sampling
now tuninge 0.98604584441
now sampling
now tuninge 0.999981156269
now sampling
now tuninge 1.0
now sampling
Sampler ended at time 64 after 418.643194914 seconds
Now runing smc sampler with HMC kernel
now tuning
now sampling
now tuninge 0.00849941372871
now sampling
now tuninge 0.016993102268
now sampling
now tuninge 0.0252928618402
```

```
now sampling
```

now sampling

now tuninge 0.0412156246044

now sampling

now tuninge 0.0496442691398

now sampling

now tuninge 0.0581629200641

now sampling

now tuninge 0.0669250863823

now sampling

now tuninge 0.0755141369947

now sampling

now tuninge 0.0842260793948

now sampling

now tuninge 0.092932369759

now sampling

now tuninge 0.10170210915

now sampling

now tuninge 0.109967874668

now sampling

now tuninge 0.11845628033

now sampling

now tuninge 0.126554639784

now sampling

now tuninge 0.134972786018

now sampling

now tuninge 0.143510237416

now sampling

now tuninge 0.152433758519

now sampling

now tuninge 0.16148113507

now sampling

now tuninge 0.170437632748

now sampling

now tuninge 0.179281354872

now sampling

now tuninge 0.188206267831

now sampling

now tuninge 0.196615920687

now sampling

now tuninge 0.204667950279

now sampling

now tuninge 0.213037009288

now sampling

now tuninge 0.221718679607

now sampling

```
now sampling
```

now sampling

now tuninge 0.248135699968

now sampling

now tuninge 0.256725584105

now sampling

now tuninge 0.265497323185

now sampling

now tuninge 0.274345346272

now sampling

now tuninge 0.282829172394

now sampling

now tuninge 0.290972634844

now sampling

now tuninge 0.299277027318

now sampling

now tuninge 0.307736090242

now sampling

now tuninge 0.316137805567

now sampling

now tuninge 0.324696632038

now sampling

now tuninge 0.333653654935

now sampling

now tuninge 0.342750235825

now sampling

now tuninge 0.351810661909

now sampling

now tuninge 0.36068046844

now sampling

now tuninge 0.369518641366

now sampling

now tuninge 0.378461312605

now sampling

now tuninge 0.387701992403

now sampling

now tuninge 0.397397176056

now sampling

now tuninge 0.406786481422

now sampling

now tuninge 0.415432818678

now sampling

now tuninge 0.424514416508

now sampling

now tuninge 0.433237591304

now sampling

```
now sampling
```

now sampling

now tuninge 0.459647413267

now sampling

now tuninge 0.46803064527

now sampling

now tuninge 0.476159839007

now sampling

now tuninge 0.484073323647

now sampling

now tuninge 0.491558884515

now sampling

now tuninge 0.499189009406

now sampling

now tuninge 0.507298777338

now sampling

now tuninge 0.515653299007

now sampling

now tuninge 0.524128116811

now sampling

now tuninge 0.532653990584

now sampling

now tuninge 0.540914406712

now sampling

now tuninge 0.549354664803

now sampling

now tuninge 0.557815981412

now sampling

now tuninge 0.56634082214

now sampling

now tuninge 0.574898559805

now sampling

now tuninge 0.583592085259

now sampling

now tuninge 0.59228910816

now sampling

now tuninge 0.601064560818

now sampling

now tuninge 0.609672391035

now sampling

now tuninge 0.61845915101

now sampling

now tuninge 0.627094139102

now sampling

now tuninge 0.635564107576

now sampling

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now sampling
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now sampling

now tuninge 0.66127597443

now sampling

now tuninge 0.670002614053

now sampling

now tuninge 0.679031880888

now sampling

now tuninge 0.687708679391

now sampling

now tuninge 0.696011869501

now sampling

now tuninge 0.704683672932

now sampling

now tuninge 0.713713755057

now sampling

now tuninge 0.722903089044

now sampling

now tuninge 0.73180231578

now sampling

now tuninge 0.74089825174

now sampling

now tuninge 0.749529964697

now sampling

now tuninge 0.758029563454

now sampling

now tuninge 0.766462377716

now sampling

now tuninge 0.775139559102

now sampling

now tuninge 0.783622627331

now sampling

now tuninge 0.792140127758

now sampling

now tuninge 0.800618649674

now sampling

now tuninge 0.809357517891

now sampling

now tuninge 0.818311428985

now sampling

now tuninge 0.827342004684

now sampling

now tuninge 0.836838288283

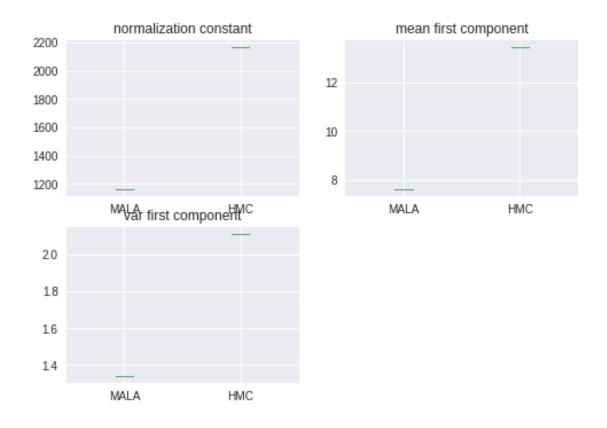
now sampling

now tuninge 0.846156659757

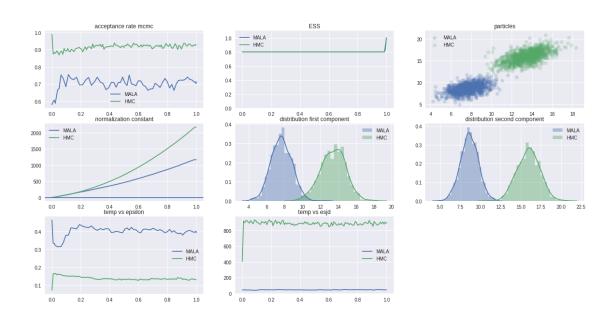
now sampling

```
now tuninge 0.863655656674
now sampling
now tuninge 0.87216277752
now sampling
now tuninge 0.880572113701
now sampling
now tuninge 0.889322974939
now sampling
now tuninge 0.897772397653
now sampling
now tuninge 0.906043361526
now sampling
now tuninge 0.914610627128
now sampling
now tuninge 0.923111811775
now sampling
now tuninge 0.931773699801
now sampling
now tuninge 0.940211025519
now sampling
now tuninge 0.948607873857
now sampling
now tuninge 0.957469567178
now sampling
now tuninge 0.966138575879
now sampling
now tuninge 0.974594437835
now sampling
now tuninge 0.98350931457
now sampling
now tuninge 0.992367905908
now sampling
now tuninge 1.0
now sampling
Sampler ended at time 117 after 1559.6117959 seconds
```

now sampling



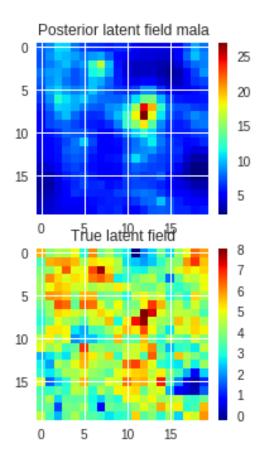
<matplotlib.figure.Figure at 0x7f82f40d3bd0>

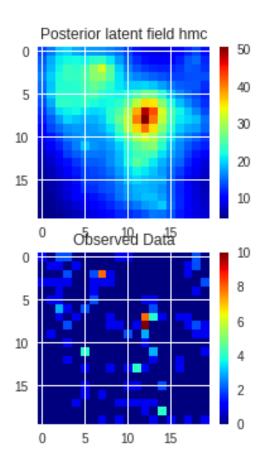


```
In [25]: x_res_matrix1 = res_first_iteration[0]['particles_resampled'].mean(axis=0).reshape(para
         x_res_matrix2 = res_first_iteration[1]['particles_resampled'].mean(axis=0).reshape(para
         Y_matrix = parameters_log_cox['Y'].reshape(parameters_log_cox['N'],parameters_log_cox['
         X_matrix = parameters_log_cox['X_true'].reshape(parameters_log_cox['N'],parameters_log_
         #plt.figure(figsize=(16,16))
         plt.subplot(221)
         plt.title('Posterior latent field mala')
         im = plt.imshow(x_res_matrix1,cmap='jet')
         plt.colorbar(im,fraction=0.046, pad=0.04)
         plt.subplot(222)
         plt.title('Posterior latent field hmc')
         im = plt.imshow(x_res_matrix2, cmap='jet')
         plt.colorbar(im,fraction=0.046, pad=0.04)
         plt.subplot(223)
         plt.title('True latent field')
         im = plt.imshow(X_matrix,cmap='jet')
         plt.colorbar(im,fraction=0.046, pad=0.04)
         plt.subplot(224)
         plt.title('Observed Data')
         im = plt.imshow(Y_matrix,cmap='jet')
         plt.colorbar(im,fraction=0.046, pad=0.04)
```

plt.savefig('log\_cox\_model\_dim\_%s.png'%(dim))

plt.show()





In []: