

Title: Numerical Methods Lecture

Speakers: Dustin Lang

Collection: Numerical Methods 2023/24

Date: January 23, 2024 - 10:15 AM

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Julia 1.9.3

Fitting a model to data

PSI Numerical Methods, 2024-Jan-16, Dustin Lang

This is a cleaned-up version of the live-coded notes from class.

First, a bit of Julia notebook syntax for installing packages.

```
[*]: ] add CSV DataFrames Optim WGLMakie
```

Resolving package versions...
 No Changes to `~/julia/environments/v1.9/Project.toml`
 No Changes to `~/julia/environments/v1.9/Manifest.toml`

If you use the interactive `julia` program from the Terminal, if you press the `[` key, it goes into "package management mode", where you can type commands like `add CSV` (exit that mode by typing backspace, or control-C).

You can also install packages with the more vanilla Julia-looking syntax like this,

```
[*]: using Pkg
      Pkg.add("CSV")
      # Or multiple packages at once...
      Pkg.add(["CSV", "DataFrames", "Optim", "WGLMakie"])

[*]: using CSV
      using DataFrames
      using WGLMakie
```

Let's assume that my experimentalist friend has sent me a data file, `data.csv`, a Comma-Separated Value file. This is a plain text format with values separated by (you guessed it) commas. It's not a super-efficient way of transferring data, but it works! We will use a function in the `CSV` package to read it, and stick it into a `DataFrame`, which is a pretty nice way of manipulating tables of data in Julia.

```
[*]: alldata = CSV.read("data.csv", DataFrame);
```

We can print out the data frame like this, which shows us a nicely formatted table of the data values and their column names and types. Here, I'm just printing out

Simple 2 7 Julia 1.9.3 | Busy Mode: Command Ln 1, Col 1 Notes-from-class.ipynb

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```
[3]: using CSV
      using DataFrames
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```

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```
[4]: alldata = CSV.read("data.csv", DataFrame);
```

We can print out the data frame like this, which shows us a nicely formatted table of the data values and their column names and types. Here, I'm just printing out the first three values for brevity.

```
[5]: alldata[1:3, :]
```

```
[5]: 3x6 DataFrame
      Row row  x    y    sigma_y  sigma_x  rho_xy
      Int64 Int64 Int64 Int64  Int64  Float64
      1   1   201  592    61         9  -0.84
      2   2   244  401    25         4   0.31
      3   3    47  583    38        11   0.64
```

Simple 2 7 Julia 1.9.3 | Idle Mode: Edit Ln 3, Col 34 Notes-from-class.ipynb

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Markdown v Julia 1.9.3

Let's have a quick look (and remind ourselves how to make plots with labelled axes and titles). The data table contains `x` and `y` values, and also `sigma_y`, that give (our experimentalist friends tell us) the Gaussian uncertainties on the measured values.

The data table actually also contains `sigma_x` values, but for now we are going to ignore those -- a pretty common thing to do in cases where one of the values is measured extremely well.

```
[40]: f = Figure()
Axis(f[1,1], title="Data", xlabel="X", ylabel="Y")
errorbars!(data.x, data.y, data.sigma_y)
# You can plot multiple things on the same plot using these commands ending with "!".
# The "!" is a common thing in Julia that means "this function modifies the state".
scatter!(data.x, data.y, markersize=10, color=:maroon)
f
```

[40]:

Simple 2 7 Julia 1.9.3 | Idle Mode: Command Ln 1, Col 1 Notes-from-class.ipynb

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Julia 1.9.3

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Maybe imagine that we are selling coffee mugs with "I love data" printed on them, and we can spend some money on advertisements, and we want to know how effective our advertisements are. So on different weeks, we spend a different amount of money on advertisements (x), and we measure how many coffee mugs we sell per day (y). Even if we spend the same amount of money on advertisements every day, there is still some variation in how many mugs we sell, so maybe we count how many we sell every day for a week, and then report the mean and the standard deviation as our measurement and uncertainty.

We don't *really* have a good physical model for how we should expect y to depend on x , but as a first shot, you probably hope that if you spend more on ads, you reach more people and some of them want to buy a mug, so you sell more. That would produce a linear relationship, $y = b + m x$. Some people always find out about your amazing mugs, so even if you don't buy any advertisements, you still sell some, but as you buy ads you sell more mugs.

A "forward model" or "generative model"

Now we can set up our model-fitting problem.

For our model, we're just going to use a *linear* model:

$$y_{pred} = f(x, \text{parameters})$$

$$y_{pred} = b + mx$$

That is, our parameters are b and m .

We're assuming our measurements y are drawn from a Gaussian probability distribution with standard deviation σ_{y_i} . That means that if you look at a single data point $x[i]$, $y[i]$, $\sigma_{y[i]}$, it has probability

$$P(y_i | x_i) = \frac{1}{\sqrt{2\pi}\sigma_{y_i}} \exp - \frac{(y_{pred}(x_i, b, m) - y_i)^2}{2\sigma_{y_i}^2}$$

And that probability, the probability for a data value given a model and parameters, is called a *likelihood*. We would say $P(y_i | x_i)$ as "the likelihood of y_i given x_i ". Note that I wrote the (simple linear) model's predicted value for y as $y_{pred}(x_i, b, m)$, a function of x_i and the model parameters b and m .

In most science cases, we actually really just care about the values of (some of) the parameters. In this little example, we probably care most about m --- how many more coffee mugs can we sell if we spend \$1 more on advertisements?

Now, that likelihood above was the likelihood for a single data value. And notice that the x_i and y_i values are *fixed* -- we've taken the measurements, those are constants. The only things we can change are the *parameters* b and m of our model. As we change those parameters, the slope of the line will change, and it will pass closer or farther from each of our data points.

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Markdown

Julia 1.9.3

pass closer or farther from each of our data points.

Since we said that our data points are (statistically) *independent*, that means that the likelihood for the whole data set is just the product of the probabilities for the individual data points. I'm going to write that likelihood with the fancy-L \mathcal{L} , but remember that it's just a probability distribution, and here, we're looking for values of b and m that will maximize the overall likelihood.

$$\mathcal{L}(y|x) = \prod_i \frac{1}{\sqrt{2\pi}\sigma_{y,i}} \exp - \frac{((y_{pred}(x_i, b, m) - y_i)^2}{2\sigma_{y,i}^2}$$

About Julia's "Optim" optimization package

Now we digress and look at the Julia package "Optim" that implements generic function optimization.

Let's write a function that we want to find the optimum of.

```
[8]: function my_func(x)
      return sin.(x) ./ x
      end;
```

Now create a vector of x values where we want to plot the function,

```
[9]: x_grid = LinRange(-10, +10, 100);
```

```
[10]: f = Figure()
      Axis(f[1,1], title="Data", xlabel="X", ylabel="Y")
      lines!(x_grid, my_func(x_grid))
      f
```

```
[10]:
```

Simple 2 7 Julia 1.9.3 | Idle Mode: Command Ln 1, Col 1 Notes-from-class.ipynb

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Above, we wrote down this likelihood function:

$$\mathcal{L}(y|x) = \prod_i \frac{1}{\sqrt{2\pi}\sigma_{y,i}} \exp\left(-\frac{(y_{pred}(x_i, b, m) - y_i)^2}{2\sigma_{y,i}^2}\right)$$

Let's start by coding that up in Julia.

```
[23]: function likelihood(params, x, y, sigma_y)
      # "unpack" the parameters
      (b,m) = params
      # compute the model's predictions for the y values
      y_pred = b .+ m .* x
      chi = (y_pred - y) ./ sigma_y
      like = 1 ./ (sqrt(2 * pi) * sigma_y) .* exp.(-0.5 .* chi.^2)
      return prod(like)
    end;
```

In class, I got myself very confused because of a weird thing in the way Julia handles vectors...

If you have vectors **a** and **b**, then **a / b** is *not* elementwise division, it returns a *matrix*!

You can get elementwise division (like the function above does) using **a ./ b**.

```
[24]: # Check it out,
      a = [1,2,3]
      b = [4,5,6]
      X = a / b

[24]: 3x3 Matrix{Float64}:
      0.0519481  0.0649351  0.0779221
      0.103896  0.12987   0.155844
      0.155844  0.194805  0.233766

[25]: # It's a 3x3 MATRIX, not a 3-element VECTOR!
      # specifically, it's the matrix where X * b = a:
      X * b

[25]: 3-element Vector{Float64}:
      1.0
      2.0
      3.0
```

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Terminal 2

We can fix this by working in log space instead of linear space. So we'll compute the log-likelihood. This is very very common in statistical analysis.

```
[29]: function log_likelihood(params, x, y, sigma_y)
      (b,m) = params
      y_pred = b .+ m .* x
      chi = (y_pred .- y) ./ sigma_y
      # Here, I am omitting the 1/(sqrt(2 pi) sigma_y) term because it is constant every time!
      loglike = -0.5 .* chi .^ 2
      return sum(loglike)
    end;
```

```
[30]: opt = optimize(p -> -log_likelihood(p, data.x, data.y, data.sigma_y), [50., 2.])
```

```
[30]: * Status: success
      * Candidate solution
        Final objective value:    9.340385e+00
      * Found with
        Algorithm:    Nelder-Mead
      * Convergence measures
         $\sqrt{\sum (y_i - \hat{y})^2} / n \leq 1.0e-08$ 
      * Work counters
        Seconds run:    0 (vs limit Inf)
        Iterations:    33
        f(x) calls:    69
```

Here, we can see that the optimizer called our function 69 times -- much more realistic than the 4 calls previously!

```
[31]: b_opt, m_opt = Optim.minimizer(opt)
```

```
[31]: 2-element Vector{Float64}:
      34.0476433503552
      2.239922318298898
```

```
[32]: f = Figure()
      Axis(f[1,1], title="Data", xlabel="X", ylabel="Y")
      errorbars!(data.x, data.y, data.sigma_y)
      scatter!(data.x, data.y, markersize=10, color=:maroon)
```

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```

[34]: -9.363035567226113

[35]: fig, ax, hm = heatmap(b_grid, m_grid, ll_grid, colrange=(-25, -9))
      Colorbar(fig[:, end+1], hm)
      scatter!(b_opt, m_opt, color=:red)
      fig

[35]:

```

Here, we can see that the b and m parameters are quite strongly (anti)correlated.

We can also plot the contours in this log-probability space:

```

[36]: f = Figure()

```

Simple 2 7 Julia 1.9.3 | Idle Mode: Edit Ln 6, Col 31 Notes-from-class.ipynb

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Code Julia 1.9.3
(b, m) = (38.36604570886841, 2.204776861928404)
(b, m) = (36.18758028279822, 2.232664062075605)

The jack-knife values are all correlated, so to go from a sample variance estimate to a jack-knife estimate, we need a N-1 correction factor:

[38]: var_b = (N-1)/N * sum((b_jack .- b_opt).^2)
      var_m = (N-1)/N * sum((m_jack .- m_opt).^2)
      cov_bm = (N-1)/N * sum((b_jack .- b_opt).*(m_jack .- m_opt))

[38]: -4.834212105071833

[ ]:
[ ]:
[ ]:
[ ]:
[ ]:
[ ]:

[ ]: function mcmc(logprob_func, propose_func, initial_p, n_steps)
      |
      end;
```

Terminal 2 | MCMC-homewo | Untitled4.ipynb | perlmutter99-jul | MCMC-filled-in. | Notes-from-clas | p99-data.txt | Notes-from-clas

Julia 1.9.3

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[38]: -4.834212105071833

[ ]:
[ ]:
[ ]:
[ ]:
[ ]:
[ ]:

[ ]: function mcmc(logprob_func, propose_func, initial_p, n_steps)
      p = initial_p
      logprob = logprob_func(p)
      chain = []
      n_accept = 0
      for i in 1:n_steps
          p_new = propose_func(p)
          logprob_new = logprob_func(p_new)

          |

      end
end;

```

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[ ]:
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      chain = []
      n_accept = 0
      for i in 1:n_steps
          p_new = propose_func(p)
          logprob_new = logprob_func(p_new)

          ratio = exp(logprob_new - logprob)

          end
      end;
```


Terminal 2 | MCMC-homewo | Untitled4.ipynb | perlmutter99-jul | MCMC-filled-in | Notes-from-clas | p99-data.txt | Notes-from-clas

Code | Julia 1.9.3

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      chain = []
      n_accept = 0
      for i in 1:n_steps
          p_new = propose_func(p)
          logprob_new = logprob_func(p_new)

          ratio = exp(logprob_new - logprob)
          if ratio > 1
              # Jump to the new place
          else
              # Jump to the new place with probability "ratio"
              u = |
          end
      end
  end
end:
```

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[38]: -4.834212105071833

[ ]:
[ ]:

[41]: ? rand
      search: rand randn transcode GradientDescent rainclouds rainclouds! RainClouds

[41]: rand([rng=default_rng()], S, [dims...])
      Pick a random element or array of random elements from the set of values specified by S; S can be
      • an indexable collection (for example 1:9 or ('x', "y", :z) ),
      • an AbstractDict or AbstractSet object,
      • a string (considered as a collection of characters), or
      • a type: the set of values to pick from is then equivalent to typemin(S):typemax(S) for integers (this is not applicable to BigInt ), to [0, 1] for floating
        point numbers and to [0, 1)+i[0, 1] for complex floating point numbers;
      S defaults to Float64 . When only one argument is passed besides the optional rng and is a Tuple , it is interpreted as a collection of values ( S ) and not as
      dims .

      !!! compat "Julia 1.1" Support for S as a tuple requires at least Julia 1.1.

Examples

julia> rand(Int, 2)

```


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Terminal 2

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```

```
[38]: -4.834212105071833
```

```
[ ]:
```

```
[ ]:
```

```
[46]: rand()
```

```
[46]: 0.32329600582988793
```

```
[47]: hist(rand(1000))
```

```
[47]:
```


Simple 2 7 Julia 1.9.3 | Idle Saving started Mode: Command Ln 1, Col 1 Notes-from-class.ipynb

Filter files by name

/ ... / dlang / FittingAModel2024 /

Name	Last Modified
data.csv	8 days ago
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Notes-from-class.ipynb	seconds ago
old.ipynb	7 days ago
README.md	8 days ago
tutorial.ipynb	5 days ago
Untitled.ipynb	7 days ago

```
Terminal 2 x MCMC-homewo x Untitled4.ipynb x perlmutter99-jul x MCMC-filled-in. x Notes-from-clas x p99-data.txt x Notes-from-clas x Julia 1.9.3
```



```
[ ]:
```

```
[ ]: function mcmc(logprob_func, propose_func, initial_p, n_steps)
    p = initial_p
    logprob = logprob_func(p)
    chain = []
    n_accept = 0
    for i in 1:n_steps
        p_new = propose_func(p)
        logprob_new = logprob_func(p_new)

        ratio = exp(logprob_new - logprob)
        if ratio > 1
            # Jump to the new place
        else
            # Jump to the new place with probability "ratio"
            u = rand()
            if u < ratio
                # Jump to the new place
            else
                # Stay where we are
            end
        end
    end
end
end;
```

Filter files by name 🔍

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Name	Last Modified
data.csv	8 days ago
LICENSE	8 days ago
Notes-from-class-1.ipynb	5 days ago
Notes-from-class.ipynb	2 minutes ago
old.ipynb	7 days ago
README.md	8 days ago
tutorial.ipynb	5 days ago
Untitled.ipynb	7 days ago

Terminal 2 × MCMC-homewo × Untitled4.ipynb × perlmutter99-jul × MCMC-filled-in. × Notes-from-clas × p99-data.txt × Notes-from-clas ●

Code Julia 1.9.3

```
[ ]:  
[ ]: function mcmc(logprob_func, propose_func, initial_p, n_steps)  
    p = initial_p  
    logprob = logprob_func(p)  
    chain = []  
    n_accept = 0  
    for i in 1:n_steps  
        p_new = propose_func(p)  
        logprob_new = logprob_func(p_new)  
  
        ratio = exp(logprob_new - logprob)  
        if ratio > 1  
            # Jump to the new place  
  
        else  
            # Jump to the new place with probability "ratio"  
            u = rand()  
            if u < ratio  
                # Jump to the new place  
            else  
                # Stay where we are  
            end  
        end  
    end  
end  
end;
```

Simple 2 7 Julia 1.9.3 | Idle Mode: Edit Ln 13, Col 13 Notes-from-class.ipynb

Filter files by name

/ ... / dlang / FittingAModel2024 /

Name	Last Modified
data.csv	8 days ago
LICENSE	8 days ago
Notes-from-class-1.ipynb	5 days ago
Notes-from-class.ipynb	2 minutes ago
old.ipynb	7 days ago
README.md	8 days ago
tutorial.ipynb	5 days ago
Untitled.ipynb	7 days ago

```
Terminal 2 x MCMC-homewo x Untitled4.ipynb x perlmutter99-jul x MCMC-filled-in.i x Notes-from-clas x p99-data.txt x Notes-from-clas x  
Code Julia 1.9.3  
0 1.0  
[ ]:  
[ ]: function mcmc(logprob_func, propose_func, initial_p, n_steps)  
    p = initial_p  
    logprob = logprob_func(p)  
    chain = []  
    n_accept = 0  
    for i in 1:n_steps  
        p_new = propose_func(p)  
        logprob_new = logprob_func(p_new)  
  
        ratio = exp(logprob_new - logprob)  
        if ratio > 1  
            # Jump to the new place  
            p = p_new  
            logprob = logprob_new  
        else  
            # Jump to the new place with probability "ratio"  
            u = rand()  
            if u < ratio  
                # Jump to the new place  
                p = p_new  
                logprob = logprob_new  
            else  
                # Stay where we are  
            end  
        end  
    end  
end  
end;
```

Filter files by name 🔍

... / dlang / FittingAModel2024 /

Name	Last Modified
data.csv	8 days ago
LICENSE	8 days ago
Notes-from-class-1.ipynb	5 days ago
Notes-from-class.ipynb	in a few seconds
old.ipynb	7 days ago
README.md	8 days ago
tutorial.ipynb	5 days ago
Untitled.ipynb	7 days ago

```
Terminal 2 x MCMC-homewo x Untitled4.ipynb x perlmutter99-jul x MCMC-filled-in. x Notes-from-clas x p99-data.txt x Notes-from-clas x
Code Julia 1.9.3
[ ]:
[54]: function mcmc(logprob_func, propose_func, initial_p, n_steps)
      p = initial_p
      logprob = logprob_func(p)
      chain = []
      n_accept = 0
      for i in 1:n_steps
        p_new = propose_func(p)
        logprob_new = logprob_func(p_new)

        ratio = exp(logprob_new - logprob)
        if ratio > 1
          # Jump to the new place
          p = p_new
          logprob = logprob_new
          n_accept += 1
        else
          # Jump to the new place with probability "ratio"
          u = rand()
          if u < ratio
            # Jump to the new place
            p = p_new
            logprob = logprob_new
            n_accept += 1
          else
            # Stay where we are
          end
        end
        # Equivalent to
        # if ratio > rand():

        accept!(chain, p)

      end
      chain, n_accept/n_steps
end;
[52]: nothing
[ ]:
```


Browser address bar: <https://symmetry.pi.local/user/dlang/lab/workspaces/auto-w/tree/home/dlang/FittingAModel2024/Notes-from-class.ipynb>

File Edit View Run Kernel Tabs Settings Help

Filter files by name

Name	Last Modified
data.csv	8 days ago
LICENSE	8 days ago
Notes-from-class-1.ipynb	5 days ago
Notes-from-class.ipynb	seconds ago
old.ipynb	7 days ago
README.md	8 days ago
tutorial.ipynb	5 days ago
Untitled.ipynb	7 days ago

```
[ ]:
[54]: function mcmc(logprob_func, propose_func, initial_p, n_steps)
      p = initial_p
      logprob = logprob_func(p)
      chain = []
      n_accept = 0
      for i in 1:n_steps
        p_new = propose_func(p)
        logprob_new = logprob_func(p_new)

        ratio = exp(logprob_new - logprob)
        if ratio > 1
          # Jump to the new place
          p = p_new
          logprob = logprob_new
          n_accept += 1
        else
          # Jump to the new place with probability "ratio"
          u = rand()
          if u < ratio
            # Jump to the new place
            p = p_new
            logprob = logprob_new
            n_accept += 1
          else
            # Stay where we are
          end
        end
        # Equivalent to
        # if ratio > rand():

        accept!(chain, p)

      end
      chain, n_accept/n_steps
    end;

• [52]: function propose(
[ ]:
```

Simple 2 7 Julia 1.9.3 | Idle Mode: Edit Ln 1, Col 18 Notes-from-class.ipynb

Filter files by name

/ ... / dlang / FittingAModel2024 /

Name	Last Modified
data.csv	8 days ago
LICENSE	8 days ago
Notes-from-class-1.ipynb	5 days ago
Notes-from-class.ipynb	a minute ago
old.ipynb	7 days ago
README.md	8 days ago
tutorial.ipynb	5 days ago
Untitled.ipynb	7 days ago

```
Terminal 2 x MCMC-homewo x Untitled4.ipynb x perlmutter99-jul x MCMC-filled-in... x Notes-from-clas x p99-data.txt x Notes-from-clas
Code
Julia 1.9.3

p_new = propose_func(p)
logprob_new = logprob_func(p_new)

ratio = exp(logprob_new - logprob)
if ratio > 1
    # Jump to the new place
    p = p_new
    logprob = logprob_new
    n_accept += 1
else
    # Jump to the new place with probability "ratio"
    u = rand()
    if u < ratio
        # Jump to the new place
        p = p_new
        logprob = logprob_new
        n_accept += 1
    else
        # Stay where we are
    end
end
# Equivalent to
# if ratio > rand():

accept!(chain, p)

end
chain, n_accept/n_steps
end;

•[52]: function propose(p)
end

[ ]:
```


Browser: <https://symmetry.pi.local/user/dlang/lab/workspaces/auto-w/tree/home/dlang/FittingAModel2024/Notes-from-class.ipynb> 120% Search

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Name	Last Modified
data.csv	8 days ago
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Notes-from-class-1.ipynb	5 days ago
Notes-from-class.ipynb	seconds ago
old.ipynb	7 days ago
README.md	8 days ago
tutorial.ipynb	5 days ago
Untitled.ipynb	7 days ago

Terminal 2 x MCMC-homewo x Untitled4.ipynb x perlmutter99-jul x MCMC-filled-in. x Notes-from-clas x p99-data.txt x Notes-from-clas

Code Julia 1.9.3

```
[ ]:
[ ]:
[46]: rand()
[46]: 0.32329600582988793
[*]: hist(randn(1000000))
[ ]:
[54]: function mcmc(logprob_func, propose_func, initial_p, n_steps)
      p = initial_p
      logprob = logprob_func(p)
      chain = []
      n_accept = 0
      for i in 1:n_steps
        p_new = propose_func(p)
        logprob_new = logprob_func(p_new)

        ratio = exp(logprob_new - logprob)
        if ratio > 1
          # Jump to the new place
          p = p_new
          logprob = logprob_new
          n_accept += 1
        else
          # Jump to the new place with probability "ratio"
          u = rand()
          if u < ratio
            # Jump to the new place
            p = p_new
            logprob = logprob_new
            n_accept += 1
          else
            # Stay where we are
          end
        end
      end
      # Equivalent to
```

Simple 2 7 Julia 1.9.3 | Busy Mode: Command Ln 1, Col 1 Notes-from-class.ipynb

Browser address bar: <https://symmetry.pl.local/user/dlang/lab/workspaces/auto-w/tree/home/dlang/FittingAModel2024/Notes-from-class.ipynb>

File Edit View Run Kernel Tabs Settings Help

Filter files by name

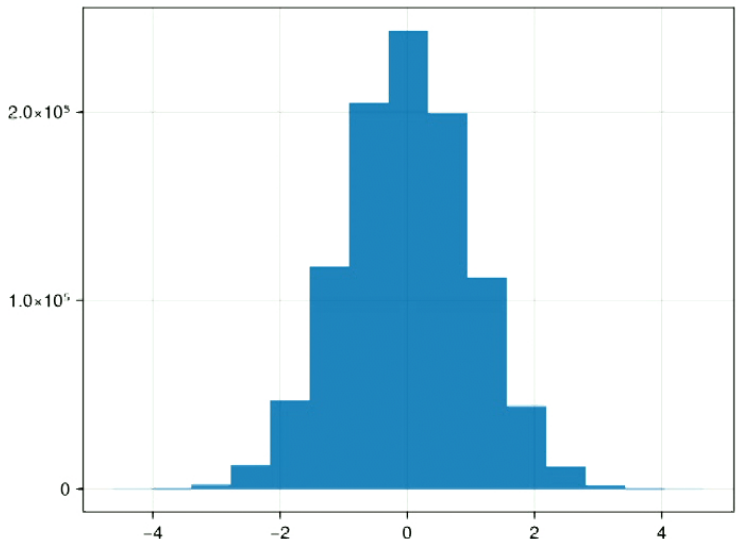
... / dlang / FittingAModel2024 /

Name	Last Modified
data.csv	8 days ago
LICENSE	8 days ago
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Notes-from-class.ipynb	seconds ago
old.ipynb	7 days ago
README.md	8 days ago
tutorial.ipynb	5 days ago
Untitled.ipynb	7 days ago

Terminal 2 | MCMC-homewo | Untitled4.ipynb | perlmutter99-jul | MCMC-filled-in. | Notes-from-clas | p99-data.txt | Notes-from-clas

Code

```
[ ]:  
[ ]:  
[46]: rand()  
[46]: 0.32329600582988793  
[61]: hist(randn(1000000))  
[61]:  
[ ]:  
[54]: function mcmc(logprob_func, propose_func, initial_p, n_steps)
```



Simple 2 7 Julia 1.9.3 | Idle Mode: Command Ln 1, Col 1 Notes-from-class.ipynb

Terminal 2 x MCMC-homewo x Untitled4.ipynb x perlmutter99-jul x MCMC-filled-in. x Notes-from-clas x p99-data.txt x Notes-from-clas

Julia 1.9.3

Filter files by name

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Name	Last Modified
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Notes-from-class.ipynb	seconds ago
old.ipynb	7 days ago
README.md	8 days ago
tutorial.ipynb	5 days ago
Untitled.ipynb	7 days ago

```

[54]: function mcmc(logprob_func, propose_func, initial_p, n_steps)
    p = initial_p
    logprob = logprob_func(p)
    chain = []
    n_accept = 0
    for i in 1:n_steps
        p_new = propose_func(p)
        logprob_new = logprob_func(p_new)

        ratio = exp(logprob_new - logprob)
        if ratio > 1
            # Jump to the new place
            p = p_new
            logprob = logprob_new
            n_accept += 1
        else
            # Jump to the new place with probability "ratio"
            u = rand()
            if u < ratio
                # Jump to the new place
                p = p_new
                logprob = logprob_new
                n_accept += 1
            else
                # Stay where we are
            end
        end
        # Equivalent to
        # if ratio > rand():
        accept!(chain, p)
    end
    chain, n_accept/n_steps
end;

[66]: function propose(p, jump_sizes)
    p .+ randn(length(p)) .* jump_sizes
end

```

Simple 2 7 Julia 1.9.3 | Idle Mode: Edit Ln 1, Col 10 Notes-from-class.ipynb

Filter files by name 🔍

... / dlang / FittingAModel2024 /

Name	Last Modified
data.csv	8 days ago
LICENSE	8 days ago
Notes-from-class-1.ipynb	5 days ago
Notes-from-class.ipynb	a minute ago
old.ipynb	7 days ago
README.md	8 days ago
tutorial.ipynb	5 days ago
Untitled.ipynb	7 days ago

```
logprob = logprob_new
n_accept += 1
else
    # Stay where we are
end
end
# Equivalent to
# if ratio > rand():
accept!(chain, p)
end
chain, n_accept/n_steps
end;
```

```
[67]: function propose(p, jump_sizes)
      p .+ randn(length(p)) .* jump_sizes
      end;
```

```
• [65]: initial_guess
        mcmc(log_likelihood, propose, initial_p, n_steps)
```

```
[65]: 3-element Vector{Float64}:
      -0.4433560756110791
       1.7158823975846498
      -0.8015750670262585
```

```
[ ]:
```

```
[ ]:
```

Filter files by name

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Name	Last Modified
data.csv	8 days ago
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Notes-from-class.ipynb	a minute ago
old.ipynb	7 days ago
README.md	8 days ago
tutorial.ipynb	5 days ago
Untitled.ipynb	7 days ago

```
logprob = logprob_new
n_accept += 1
else
    # Stay where we are
end
end
# Equivalent to
# if ratio > rand():
accept!(chain, p)
end
chain, n_accept/n_steps
end;
```

```
[67]: function propose(p, jump_sizes)
      p .+ randn(length(p)) .* jump_sizes
      end;
```

```
[65]: initial_guess = [20., 2.]
      chain = mcmc(log_likelihood, propose, initial_guess, 1000)
```

```
[65]: 3-element Vector{Float64}:
      -0.4433560756110791
       1.7158823975846498
      -0.8015750670262585
```

```
[ ]:
```

```
[ ]:
```


Filter files by name

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Notes-from-class.ipynb	a minute ago
old.ipynb	7 days ago
README.md	8 days ago
tutorial.ipynb	5 days ago
Untitled.ipynb	7 days ago

```
logprob = logprob_new
n_accept += 1
else
    # Stay where we are
end
end
# Equivalent to
# if ratio > rand():
accept!(chain, p)
end
chain, n_accept/n_steps
end;
```

```
[67]: function propose(p, jump_sizes)
      p .+ randn(length(p)) .* jump_sizes
      end;
```

```
[68]: initial_guess = [20., 2.]

      chain = mcmc(log_likelihood, propose, initial_guess, 1000)

      MethodError: no method matching log_likelihood(::Vector{Float64})

      Closest candidates are:
        log_likelihood(::Any, ::Any, ::Any, ::Any)
          @ Main In[29]:1

      Stacktrace:
      [1] mcmc(logprob_func::typeof(log_likelihood), propose_func::typeof(propose), initial_p::Vector{Float64}, n_steps::Int64)
          @ Main ./In[54]:3
      [2] top-level scope
          @ In[68]:3
```

Filter files by name

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data.csv	8 days ago
LICENSE	8 days ago
Notes-from-class-1.ipynb	5 days ago
Notes-from-class.ipynb	seconds ago
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README.md	8 days ago
tutorial.ipynb	5 days ago
Untitled.ipynb	7 days ago

```
logprob = logprob_new
n_accept += 1
else
    # Stay where we are
end
end
# Equivalent to
# if ratio > rand():
accept!(chain, p)
end
chain, n_accept/n_steps
end;
```

```
[67]: function propose(p, jump_sizes)
      p .+ randn(length(p)) .* jump_sizes
      end;
```

```
[69]: initial_guess = [20., 2.]
      jump_sizes = []

      chain = mcmc(p -> log_likelihood(p, data.x, data.y, data.sigma_y),
                  propose, initial_guess, 1000)
```

MethodError: no method matching propose(::Vector{Float64})

Closest candidates are:

```
propose(::Any, ::Any)
  @ Main In[67]:1
```

Stacktrace:

```
[1] mcmc(logprob_func::var"#15#16", propose_func::typeof(propose), initial_p::Vector{Float64}, n_steps::Int64)
  @ Main ./In[54]:7
 [2] top-level scope
  @ In[69]:3
```


Filter files by name

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Name	Last Modified
data.csv	8 days ago
LICENSE	8 days ago
Notes-from-class-1.ipynb	5 days ago
Notes-from-class.ipynb	a minute ago
old.ipynb	7 days ago
README.md	8 days ago
tutorial.ipynb	5 days ago
Untitled.ipynb	7 days ago

```
logprob = logprob_new
n_accept += 1
else
    # Stay where we are
end
end
# Equivalent to
# if ratio > rand():
append!(chain, p)
end
chain, n_accept/n_steps
end;
```

```
[67]: function propose(p, jump_sizes)
      p .+ randn(length(p)) .* jump_sizes
      end;
```

```
[70]: initial_guess = [20., 2.]
      jump_sizes = [1., 0.1]

      chain = mcmc(p -> log_likelihood(p, data.x, data.y, data.sigma_y),
                  p -> propose(p, jump_sizes),
                  initial_guess, 1000)
```

UndefVarError: `accept!` not defined

Stacktrace:

```
[1] mcmc(logprob_func::var"#17#19", propose_func::var"#18#20", initial_p::Vector{Float64}, n_steps::Int64)
@ Main ./In[54]:31
[2] top-level scope
@ In[70]:4
```

```
[ ]:
[ ]:
```

Filter files by name

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Name	Last Modified
data.csv	8 days ago
LICENSE	8 days ago
Notes-from-class-1.ipynb	5 days ago
Notes-from-class.ipynb	2 minutes ago
old.ipynb	7 days ago
README.md	8 days ago
tutorial.ipynb	5 days ago
Untitled.ipynb	7 days ago

```
logprob = logprob_new
n_accept += 1
else
    # Stay where we are
end
end
# Equivalent to
# if ratio > rand():
append!(chain, p)
end
chain, n_accept/n_steps
end;
```

```
[67]: function propose(p, jump_sizes)
      p .+ randn(length(p)) .* jump_sizes
      end;
```

```
[72]: initial_guess = [20., 2.]
      jump_sizes = [1., 0.1]

      chain = mcmc(p -> log_likelihood(p, data.x, data.y, data.sigma_y),
                  p -> propose(p, jump_sizes),
                  initial_guess, 1000)
```

```
[72]: (Any[18.220306441536163, 2.0936778419744844, 18.220306441536163, 2.0936778419744844, 18.220306441536163, 2.0936778419744844, 18.220306441536163, 2.0936778419744844, 16.675792307250028, 2.174169674532106 ... 40.591957635839265, 2.1731634255400616, 40.591957635839265, 2.1731634255400616, 40.830058430552555, 2.1908837216448176, 40.830058430552555, 2.1908837216448176], 0.331)
```

```
[ ]:
```

```
[ ]:
```

Filter files by name

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Name	Last Modified
data.csv	8 days ago
LICENSE	8 days ago
Notes-from-class-1.ipynb	5 days ago
Notes-from-class.ipynb	seconds ago
old.ipynb	7 days ago
README.md	8 days ago
tutorial.ipynb	5 days ago
Untitled.ipynb	7 days ago

```
logprob = logprob_new
n_accept += 1
else
    # Stay where we are
end
end
# Equivalent to
# if ratio > rand():
append!(chain, p)
end
chain, n_accept/n_steps
end;
```

[67]: function propose(p, jump_sizes)
p .+ randn(length(p)) .* jump_sizes
end;

[73]: initial_guess = [20., 2.]
jump_sizes = [1., 0.1]

chain, accept_rate = mcmc(p -> log_likelihood(p, data.x, data.y, data.sigma_y),
p -> propose(p, jump_sizes),
initial_guess, 1000)

[73]: (Any[17.702366587742652, 2.0482607401164885, 18.831676243877908, 2.1127523603969713, 18.831676243877908, 2.1127523603969713, 18.686208439977122, 2.191888891578504, 18.686208439977122, 2.191888891578504 ... 25.468814075311844, 2.2996321357058247, 25.78364397476287, 2.3269468263916537, 25.78364397476287, 2.3269468263916537, 26.428481599162065, 2.3241194094855526, 26.428481599162065, 2.3241194094855526], 0.344)

[74]: accept_rate

[74]: 0.344

[]: | I

Filter files by name

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Name	Last Modified
data.csv	8 days ago
LICENSE	8 days ago
Notes-from-class-1.ipynb	5 days ago
Notes-from-class.ipynb	seconds ago
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README.md	8 days ago
tutorial.ipynb	5 days ago
Untitled.ipynb	7 days ago

```
Terminal 2 x MCMC-homewo x Untitled4.ipynb x perlmutter99-jul x MCMC-filled-in. x Notes-from-clas x p99-data.txt x Notes-from-clas
Code
Julia 1.9.3
[73]: initial_guess = [20., 2.]
      jump_sizes = [1., 0.1]

      chain, accept_rate = mcmc(p -> log_likelihood(p, data.x, data.y, data.sigma_y),
                              p -> propose(p, jump_sizes),
                              initial_guess, 1000)

[73]: (Any{17.702366587742652, 2.0482607401164885, 18.831676243877908, 2.1127523603969713, 18.831676243877908, 2.1127523603969713, 18.6862084399
77122, 2.191888891578504, 18.686208439977122, 2.191888891578504 ... 25.468814075311844, 2.2996321357058247, 25.78364397476287, 2.326946826
3916537, 25.78364397476287, 2.3269468263916537, 26.428481599162065, 2.324119409485526, 26.428481599162065, 2.324119409485526}, 0.344)

[74]: accept_rate

[74]: 0.344

[75]: chain

[75]: 2000-element Vector{Any}:
17.702366587742652
 2.0482607401164885
18.831676243877908
 2.1127523603969713
18.831676243877908
 2.1127523603969713
18.686208439977122
 2.191888891578504
18.686208439977122
 2.191888891578504
18.00330138730513
 2.2997815884373227
17.261835054735858
  ...
25.468814075311844
 2.2996321357058247
25.468814075311844
 2.2996321357058247
25.78364397476287
 2.3269468263916537
25.78364397476287
 2.3269468263916537
26.428481599162065
 2.324119409485526
```


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Name	Last Modified
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Notes-from-class.ipynb	in a few seconds
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tutorial.ipynb	5 days ago
Untitled.ipynb	7 days ago

```
logprob = logprob_new
n_accept += 1

else
    # Stay where we are
end

end
# Equivalent to
# if ratio > rand():

chain[i, :] = p

end
chain, n_accept/n_steps
end;

[67]: function propose(p, jump_sizes)
      p .* randn(length(p)) .* jump_sizes
end;

[77]: initial_guess = [20., 2.]
      jump_sizes = [1., 0.1]

      chain, accept_rate = mcmc(p -> log_likelihood(p, data.x, data.y, data.sigma_y),
                              p -> propose(p, jump_sizes),
                              initial_guess, 1000)

[77]: ([19.850332332523458 2.0608185641216306; 19.44797967735185 2.1387133347184006; ... ; 31.135627848429532 2.2650249767226436; 31.3918017576400
6 2.2978455758898537], 0.333)

[74]: accept_rate

[74]: 0.344

[75]: chain

[75]: 2000-element Vector{Any}:
      17.702366587742652
      2.0482607401164885
      18.831676243877908
      2.1127523603969713
      18.831676243877908
      2.1127523603969713
```

Filter files by name

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Notes-from-class.ipynb	seconds ago
old.ipynb	7 days ago
README.md	8 days ago
tutorial.ipynb	5 days ago
Untitled.ipynb	7 days ago

```
end
# Equivalent to
# if ratio > rand():

chain[i, 1:end] = p

end
chain, n_accept/n_steps
end;

[67]: function propose(p, jump_sizes)
p .* randn(length(p)) .* jump_sizes
end;

[80]: initial_guess = [20., 2.]
jump_sizes = [1., 0.1]

chain, accept_rate = mcmc(p -> log_likelihood(p, data.x, data.y, data.sigma_y),
p -> propose(p, jump_sizes),
initial_guess, 1000)
@show accept_rate
@show chain

accept_rate = 0.355
chain = [19.669417603730086 2.17855319422004; 19.669417603730086 2.17855319422004; 19.669417603730086 2.17855319422004; 19.145223774391322
2.165657678590999; 19.145223774391322 2.165657678590999; 19.145223774391322 2.165657678590999; 17.296414812447935 2.20565407819418; 17.296
414812447935 2.20565407819418; 16.321785815462825 2.228867640959087; 17.027121386289668 2.2650012309053267; 15.471532017007336 2.285748056
4307258; 15.471532017007336 2.2857480564307258; 15.471532017007336 2.2857480564307258; 14.563251058130271 2.329986600496415; 14.5632510581
30271 2.329986600496415; 14.825944222566322 2.2939508399729385; 13.737132628019003 2.356345685401879; 13.737132628019003 2.35634568540187
9; 13.737132628019003 2.356345685401879; 13.737132628019003 2.356345685401879; 13.737132628019003 2.356345685401879; 13.737132628019003 2.
356345685401879; 14.048784105002653 2.3810763677265783; 14.048784105002653 2.3810763677265783; 14.048784105002653 2.3810763677265783; 13.6
02238962924302 2.2849432604302993; 15.462533256687253 2.392809511730155; 15.462533256687253 2.392809511730155; 15.462533256687253 2.392809
511730155; 16.173827275502934 2.341644513771848; 16.173827275502934 2.341644513771848; 16.173827275502934 2.341644513771848; 16.173827275502934
02934 2.341644513771848; 16.173827275502934 2.341644513771848; 16.173827275502934 2.341644513771848; 16.173827275502934 2.341644513771848;
16.173827275502934 2.341644513771848; 16.173827275502934 2.341644513771848; 16.81397859220813 2.3140319136813097; 15.404036277062636 2.353
883719443365; 15.404036277062636 2.353883719443365; 15.162664082121722 2.3207190852089505; 15.162664082121722 2.3207190852089505; 15.16266
4082121722 2.3207190852089505; 15.255917075217207 2.3279346716703153; 15.255917075217207 2.3279346716703153; 15.255917075217207 2.32793467
16703153; 15.255917075217207 2.3279346716703153; 15.255917075217207 2.3279346716703153; 15.309386711348452 2.3445264083623174; 15.30938671
1348452 2.3445264083623174; 15.309386711348452 2.3445264083623174; 15.309386711348452 2.3445264083623174; 15.309386711348452 2.34452640836
23174; 15.309386711348452 2.3445264083623174; 15.309386711348452 2.3445264083623174; 15.309386711348452 2.3445264083623174; 15.30938671134
8452 2.3445264083623174; 15.309386711348452 2.3445264083623174; 13.98812662983435 2.327290066455764
```

Terminal 2 x MCMC-homewo x Untitled4.ipynb x perlmutter99-jul x MCMC-filled-in. x Notes-from-clas x p99-data.txt x Notes-from-clas

Code

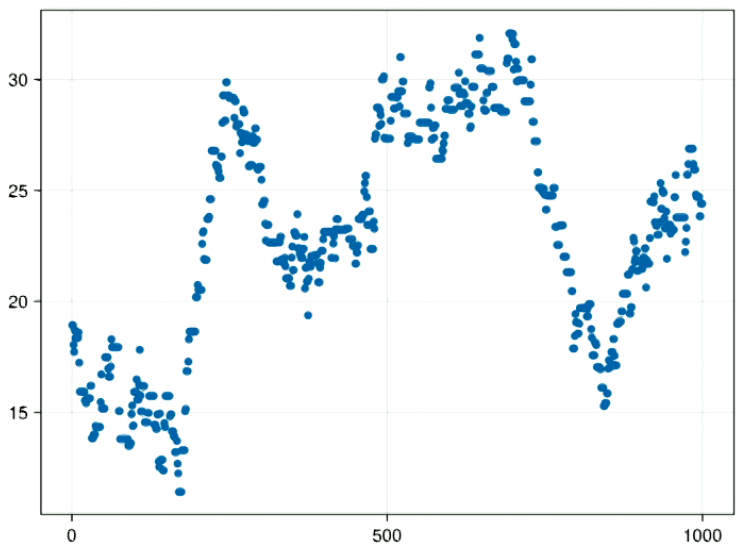
```
initial_guess, 1000)
@show accept_rate
@show size(chain)

accept_rate = 0.365
size(chain) = (1000, 2)

[81]: (1000, 2)

[85]: plot(chain[:,1])

[85]:
```



```
[ ]:
```

Simple 2 7 Julia 1.9.3 | Idle Mode: Command Ln 1, Col 1 Notes-from-class.ipynb

https://symmetry.pi.local/user/dlang/lab/workspaces/auto-w/tree/home/dlang/FittingAModel2024/Notes-from-class.ipynb 120% Search

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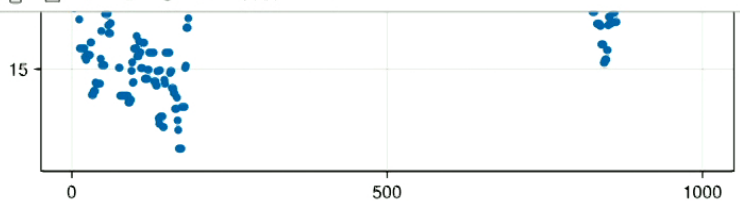
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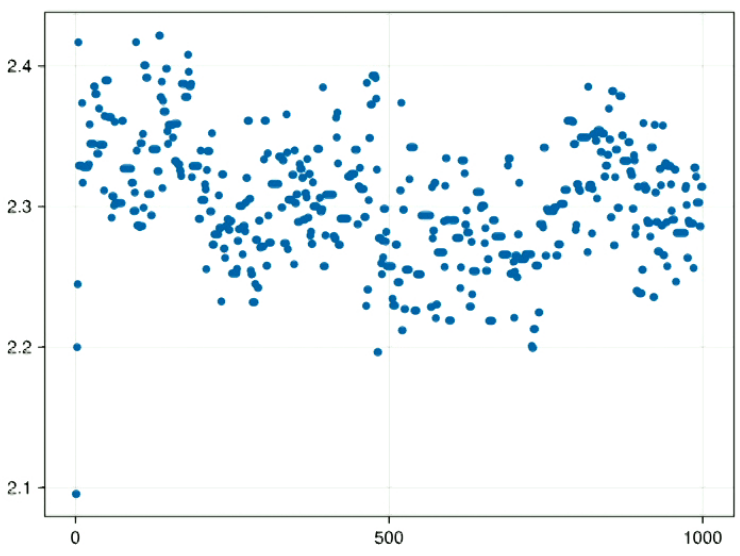
Name	Last Modified
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Terminal 2 MCMC-homewo X Untitled4.ipynb X perlmutter99-jul X MCMC-filled-in.X Notes-from-clas X p99-data.txt X Notes-from-clas

Code Julia 1.9.3



```
[87]: plot(chain[:,2])
```



Simple 2 7 Julia 1.9.3 | Idle Mode: Command Ln 1, Col 1 Notes-from-class.ipynb

<https://symmetry.pi.local/user/dlang/lab/workspaces/auto-w/tree/home/dlang/FittingAModel2024/Notes-from-class.ipynb>
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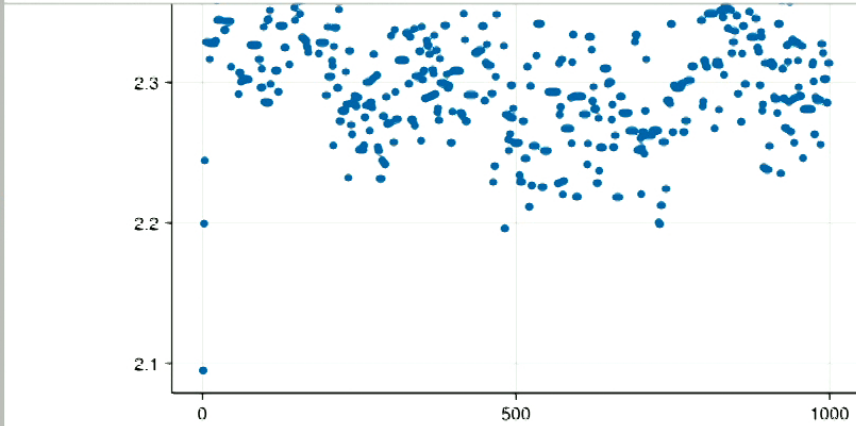
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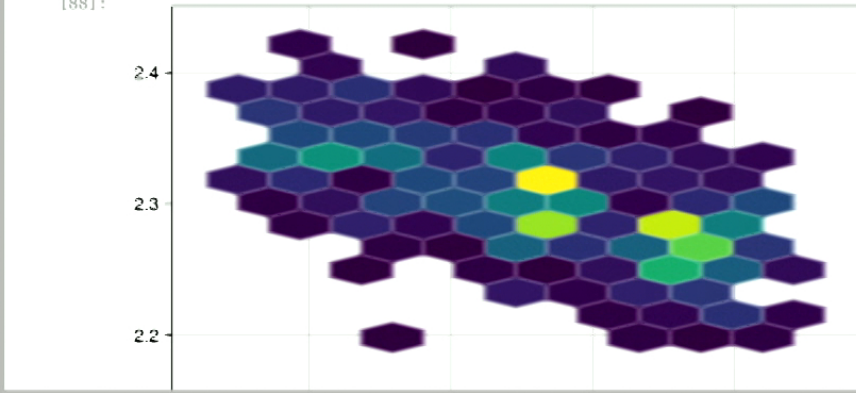
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Terminal 2 MCMC-homewo Untitled4.ipynb perlmutter99-jul MCMC-filled-in. Notes-from-clas p99-data.txt Notes-from-clas
Julia 1.9.3

Code



```
[88]: hexbin(chain[:,1], chain[:,2])
```



Simple 2 7 Julia 1.9.3 | Idle Mode: Edit Ln 1, Col 1 Notes-from-class.ipynb

https://symmetry.pi.local/user/dlang/lab/workspaces/auto-w/tree/home/dlang/FittingAModel2024/Notes-from-class.ipynb

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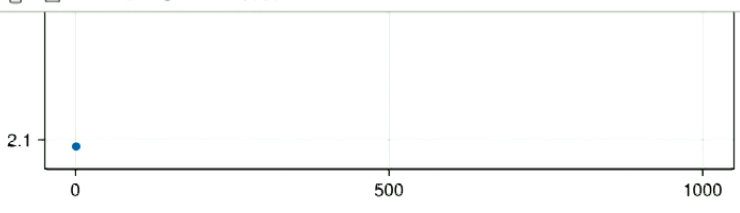
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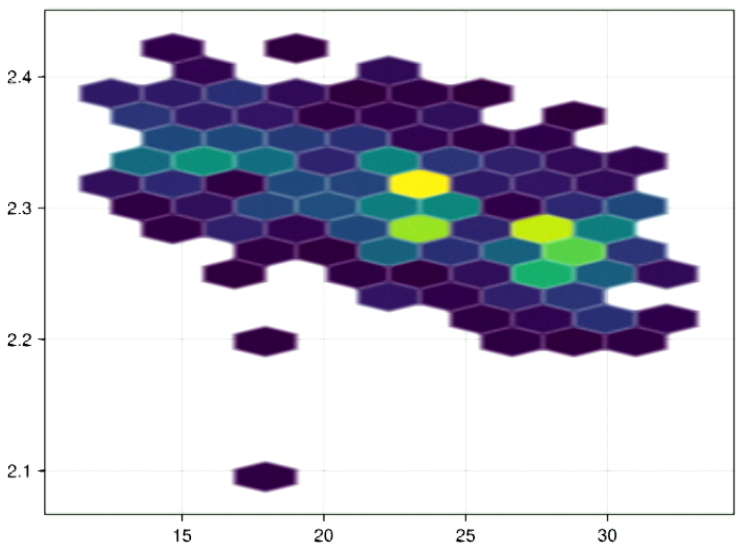
Terminal 2

Code

Julia 1.9.3



```
[88]: hexbin(chain[:,1], chain[:,2])
```



[]:

Simple 2 7 Julia 1.9.3 | Idle Mode: Edit Ln 1, Col 1 Notes-from-class.ipynb

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Terminal 2 | MCMC-homewo | Untitled4.ipynb | perlmutter99-jul | MCMC-filled-in. | Notes-from-clas | p99-data.txt | Notes-from-clas

Julia 1.9.3

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tutorial.ipynb	5 days ago
Untitled.ipynb	7 days ago

[89]:

```
fig, ax, hm = heatmap(b_grid, m_grid, ll_grid, colrange=(-25, -9))
Colorbar(fig[:, end+1], hm)
scatter!(b_opt, m_opt, color=:red)
fig
```

[89]:

Simple 2 7 Julia 1.9.3 | Idle Mode: Edit Ln 1, Col 1 Notes-from-class.ipynb

Browser: <https://symmetry.pl.local/user/dlang/lab/workspaces/auto-w/tree/home/dlang/FittingAModel2024/Notes-from-class.ipynb> 120%

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Filter files by name

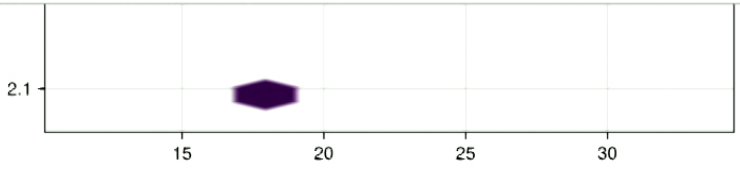
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Notes-from-class.ipynb	in a few seconds
old.ipynb	7 days ago
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tutorial.ipynb	5 days ago
Untitled.ipynb	7 days ago

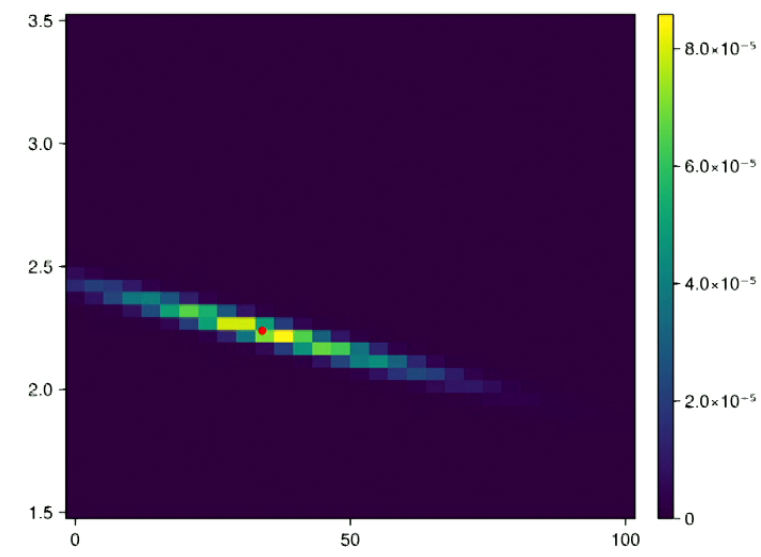
Terminal 2 | MCMC-homewo | Untitled4.ipynb | perlmutter99-jul | MCMC-filled-in. | Notes-from-clas | p99-data.txt | Notes-from-clas

Code

Julia 1.9.3



```
[90]: fig, ax, hm = heatmap(b_grid, m_grid, exp.(ll_grid))
      Colorbar(fig[:, end+1], hm)
      scatter!(b_opt, m_opt, color=:red)
      fig
```



Simple 2 7 Julia 1.9.3 | Idle Mode: Command Ln 1, Col 1 Notes-from-class.ipynb

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tutorial.ipynb	5 days ago
Untitled.ipynb	7 days ago

```
[67]: function propose(p, jump_sizes)
      p .+ randn(length(p)) .* jump_sizes
      end;

[91]: initial_guess = [20., 2.]
      jump_sizes = [1., 0.1]

      chain, accept_rate = mcmc(p -> log_likelihood(p, data.x, data.y, data.sigma_y),
                              p -> propose(p, jump_sizes),
                              initial_guess, 10000)
      @show accept_rate
      @show size(chain)

      accept_rate = 0.3442
      size(chain) = (10000, 2)

[91]: (10000, 2)

[85]: plot(chain[1:10:end,1])

[85]:
```

Filter files by name

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Terminal 2 x MCMC-homewo x Untitled4.ipynb x perlmutter99-jul x MCMC-filled-in. x Notes-from-clas x p99-data.txt x Notes-from-clas

Code Julia 1.9.3

```
initial_guess, 10000)
@show accept_rate
@show size(chain)

accept_rate = 0.3442
size(chain) = (10000, 2)

[91]: (10000, 2)

[92]: plot(chain[1:10:end, 1])

[92]:
```

```
[87]: plot(chain[:,2])

[87]:
```

Terminal 2 x MCMC-homewo x Untitled4.ipynb x perlmutter99-jul x MCMC-filled-in. x Notes-from-clas x p99-data.txt x Notes-from-clas

Julia 1.9.3

```
[95]: hexbin(chain[:,1], chain[:,2])
```

```
[90]: fig, ax, hm = heatmap(b_grid, m_grid, exp(ll_grid))
Colorbar(fig[:, end+1], hm)
scatter!(b_opt, m_opt, color=:red)
fig
```

```
[90]: 3.5 8.0 × 10-5
```

Simple 2 7 Julia 1.9.3 | Idle Mode: Command Ln 4, Col 4 Notes-from-class.ipynb

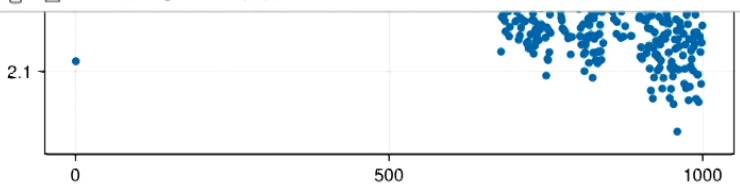
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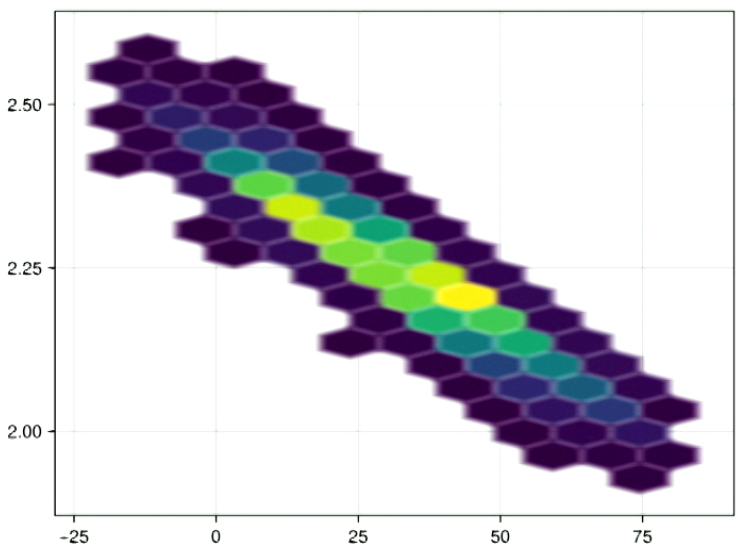
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Untitled.ipynb	7 days ago

Terminal 2 | MCMC-homewo | Untitled4.ipynb | perlmutter99-jul | MCMC-filled-in. | Notes-from-clas | p99-data.txt | Notes-from-clas

Code



```
[97]: hexbin(chain[:,1], chain[:,2])
```



```
[90]: fig, ax, hm = heatmap(b_grid, m_grid, exp.(ll_grid))
Colorbar(fig[:, end+1], hm)
```

Julia 1.9.3

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tutorial.ipynb	5 days ago
Untitled.ipynb	7 days ago

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Terminal 2 x MCMC-homewo x Untitled4.ipynb x perlmutter99-jul x MCMC-filled-in. x Notes-from-clas x p99-data.txt x Notes-from-clas ●
Code v Julia 1.9.3
chain[1, 1:end] = p

end
chain, n_accept/n_steps
end;

[67]: function propose(p, jump_sizes)
      p .* randn(length(p)) .* jump_sizes
end;

[96]: initial_guess = [20., 2.]
      jump_sizes = [1., 0.1]
      |
      chain, accept_rate = mcmc(p -> log_likelihood(p, data.x, data.y, data.sigma_y),
      | p -> propose(p, jump_sizes),
      | initial_guess, 100000)
      | @show accept_rate
      | @show size(chain)

      accept_rate = 0.34177
      size(chain) = (100000, 2)

[96]: (100000, 2)

[92]: plot(chain[1:10:end, 1])

[92]:
```

Filter files by name

Name	Last Modified
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Terminal 2 x MCMC-homewo x Untitled4.ipynb x perlmutter99-jul x MCMC-filled-in. x Notes-from-clas x p99-data.txt x Notes-from-clas
Code
Julia 1.9.3

[98]: N = 2
[98]: 2
[99]: 1 % N
[99]: 1
[100]: 2 % N
[100]: 0

•[78]: function mcmc(logprob_func, propose_func, initial_p, n_steps)
      p = initial_p
      logprob = logprob_func(p)
      chain = zeros(n_steps, length(p))
      n_accept = 0
      for i in 1:n_steps

          p_prop = propose_func(p)

          p_new = copy(p)
          p_new[i % length(p)] = p_prop[i % length(p)]

          logprob_new = logprob_func(p_new)

          ratio = exp(logprob_new - logprob)
          if ratio > 1
              # Jump to the new place
              p = p_new
              logprob = logprob_new
              n_accept += 1
          else
              # Jump to the new place with probability "ratio"
              u = rand()
              if u < ratio
                  # Jump to the new place
```

Filter files by name

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Notes-from-class.ipynb	a minute ago
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tutorial.ipynb	5 days ago
Untitled.ipynb	7 days ago

```
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Code
Julia 1.9.3

[98]: N = 2
[98]: 2
[99]: 1 % N
[99]: 1
[100]: 2 % N
[100]: 0
[101]: 3 % N
[101]: 1

• [78]: function mcmc(logprob_func, propose_func, initial_p, n_steps)
      p = initial_p
      logprob = logprob_func(p)
      chain = zeros(n_steps, length(p))
      n_accept = 0
      for i in 1:n_steps

          p_prop = propose_func(p)

          p_new = copy(p)
          p_new[i % length(p)] = p_prop[i % length(p)]

          logprob_new = logprob_func(p_new)

          ratio = exp(logprob_new - logprob)
          if ratio > 1
              # Jump to the new place
              p = p_new
              logprob = logprob_new
              n_accept += 1
          else
```

Filter files by name

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tutorial.ipynb	5 days ago
Untitled.ipynb	7 days ago

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Terminal 2 x MCMC-homewo x Untitled4.ipynb x perlmutter99-jul x MCMC-filled-in. x Notes-from-clas x p99-data.txt x Notes-from-clas x
Code
Julia 1.9.3

[98]: N = 2
[98]: 2
[99]: 1 % N
[99]: 1
[100]: 2 % N
[100]: 0
[101]: 3 % N
[101]: 1

• [78]: function mcmc(logprob_func, propose_func, initial_p, n_steps)
        p = initial_p
        logprob = logprob_func(p)
        chain = zeros(n_steps, length(p))
        n_accept = 0
        for i in 1:n_steps

            p_prop = propose_func(p)

            p_new = copy(p)
            p_new[1 + ((i-1) % length(p))] = p_prop[1 + ((i-1) % length(p))]

            logprob_new = logprob_func(p_new)

            ratio = exp(logprob_new - logprob)
            if ratio > 1
                # Jump to the new place
                p = p_new
                logprob = logprob_new
                n_accept += 1
            else
```


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Terminal 2 x MCMC-homewo x Untitled4.ipynb x perlmutter99-jul x MCMC-filled-in. x Notes-from-clas x p99-data.txt x Notes-from-clas x
Code
Julia 1.9.3
p = initial_p
logprob = logprob_func(p)
chain = zeros(n_steps, length(p))
n_accept = zeros(length(p))

for i in 1:n_steps

    p_prop = propose_func(p)

    p_new = copy(p)
    update_index = 1 + ((i-1) % length(p))
    p_new[update_index] = p_prop[update_index]

    logprob_new = logprob_func(p_new)

    ratio = exp(logprob_new - logprob)
    if ratio > 1
        # Jump to the new place
        p = p_new
        logprob = logprob_new
        n_accept[update_index] += 1
    else
        # Jump to the new place with probability "ratio"
        u = rand()
        if u < ratio
            # Jump to the new place
            p = p_new
            logprob = logprob_new
            n_accept[update_index] += 1
        else
            # Stay where we are
        end
    end
    # Equivalent to
    # if ratio > rand():

    chain[i, 1:end] = p

end
chain, n_accept ./ n_steps
end;
```

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Untitled.ipynb	7 days ago

```
Terminal 2 x MCMC-homewo x Untitled4.ipynb x perlmutter99-jul x MCMC-filled-in.l x Notes-from-clas x p99-data.txt x Notes-from-clas
Code
Julia 1.9.3

n_accept[update_index] += 1
else
    # Jump to the new place with probability "ratio"
    u = rand()
    if u < ratio
        # Jump to the new place
        p = p_new
        logprob = logprob_new
        n_accept[update_index] += 1
    else
        # Stay where we are
    end
end
# Equivalent to
# if ratio > rand():

chain[i, 1:end] = p

end
chain, n_accept ./ n_steps
end;

[67]: function propose(p, jump_sizes)
       p .+ randn(length(p)) .* jump_sizes
       end;

[96]: initial_guess = [20., 2.]
       jump_sizes = [1., 0.1]

       chain, accept_rate = mcmc(p -> log_likelihood(p, data.x, data.y, data.sigma_y),
                                p -> propose(p, jump_sizes),
                                initial_guess, 100000)
       @show accept_rate
       @show size(chain)

accept_rate = 0.34177
size(chain) = (100000, 2)

[96]: (100000, 2)

[92]: plot(chain[1:10:end, 1])

[93]:
```

https://symmetry.pi.local/user/dlang/lab/workspaces/auto-w/tree/home/dlang/FittingAModel2024/Notes-from-class.ipynb 120% Search

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README.md	8 days ago
tutorial.ipynb	5 days ago
Untitled.ipynb	7 days ago

```

n_accept[update_index] += 1
else
    # Jump to the new place with probability "ratio"
    u = rand()
    if u < ratio
        # Jump to the new place
        p = p_new
        logprob = logprob_new
        n_accept[update_index] += 1
    else
        # Stay where we are
    end
end
end
# Equivalent to
# if ratio > rand():

chain[i, 1:end] = p

end
chain, n_accept ./ n_steps
end;

[67]: function propose(p, jump_sizes)
    p .+ randn(length(p)) .* jump_sizes
end;

•[103]: initial_guess = [20., 2.]
    jump_sizes = [1., 0.01]

    chain, accept_rate = mcmc(p -> log_likelihood(p, data.x, data.y, data.sigma_y),
        p -> propose(p, jump_sizes),
        initial_guess, 10000)
    @show accept_rate
    @show size(chain)

    accept_rate = [0.4682, 0.1679]
    size(chain) = (10000, 2)

[103]: (10000, 2)

•[92]: plot(chain[1:10:end, 1])

```

Simple 2 7 Julia 1.9.3 | Idle Mode: Edit Ln 2, Col 22 Notes-from-class.ipynb

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tutorial.ipynb	5 days ago
Untitled.ipynb	7 days ago

```
Terminal 2 x MCMC-homewo x Untitled4.ipynb x perlmutter99-jul x MCMC-filled-in. x Notes-from-clas x p99-data.txt x Notes-from-clas
Code
Julia 1.9.3

    if u < ratio
        # Jump to the new place
        p = p_new
        logprob = logprob_new
        n_accept[update_index] += 1
    else
        # Stay where we are
    end
end
# Equivalent to
# if ratio > rand():
chain[i, 1:end] = p

end
chain, n_accept ./ (n_steps ./ length(p))
end;

[67]: function propose(p, jump_sizes)
      p .+ randn(length(p)) .* jump_sizes
end;

[107]: initial_guess = [20., 2.]
      jump_sizes = [1., 0.0001]

      chain, accept_rate = mcmc(p -> log_likelihood(p, data.x, data.y, data.sigma_y),
      p -> propose(p, jump_sizes),
      initial_guess, 10000)
      @show accept_rate
      @show size(chain)

      accept_rate = [0.9362, 0.9982]
      size(chain) = (10000, 2)

[107]: (10000, 2)

• [92]: plot(chain[1:10:end, 1])

[92]:
```



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```
Terminal 2 x MCMC-homewo x Untitled4.ipynb x perlmutter99-jul x MCMC-filled-in. x Notes-from-clas x p99-data.txt x Notes-from-clas
Code
Julia 1.9.3

    if u < ratio
        # Jump to the new place
        p = p_new
        logprob = logprob_new
        n_accept[update_index] += 1
    else
        # Stay where we are
    end
end
# Equivalent to
# if ratio > rand():

chain[i, 1:end] = p

end
chain, n_accept ./ (n_steps ./ length(p))
end;

[67]: function propose(p, jump_sizes)
       p .+ randn(length(p)) .* jump_sizes
       end;

•[110]: initial_guess = [20., 2.]
        jump_sizes = [2., 0.1]

        chain, accept_rate = mcmc(p -> log_likelihood(p, data.x, data.y, data.sigma_y),
        p -> propose(p, jump_sizes),
        initial_guess, 10000)
        @show accept_rate
        @show size(chain)

        accept_rate = [0.9352, 0.3474]
        size(chain) = (10000, 2)

[110]: (10000, 2)

•[92]: plot(chain[1:10:end, 1])

[92]:
```

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Untitled.ipynb	7 days ago

Terminal 2 | MCMC-homewo | Untitled4.ipynb | perlmutter99-jul | MCMC-filled-in. | Notes-from-clas | p99-data.txt | Notes-from-clas

Code Julia 1.9.3

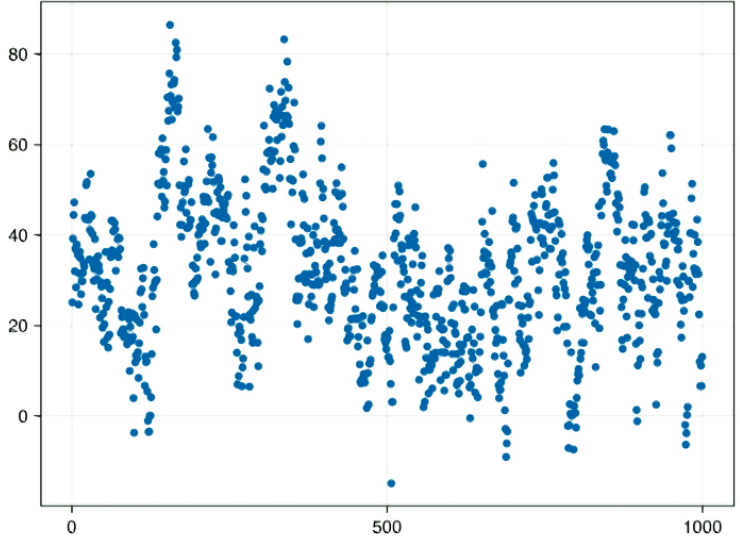
```
@show accept_rate
@show size(chain)

accept_rate = [0.495, 0.3418]
size(chain) = (10000, 2)

[115]: (10000, 2)

[116]: plot(chain[1:10:end, 1])

[116]:
```



```
[94]: plot(chain[1:10:end, 2])

[94]:
```

https://symmetry.pi.local/user/dlang/lab/workspaces/auto-w/tree/home/dlang/FittingAModel2024/Notes-from-class.ipynb

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Filter files by name

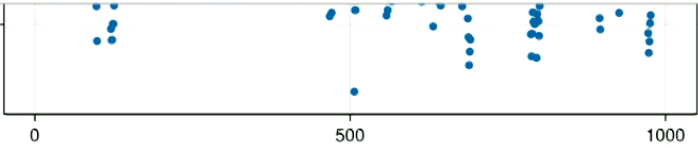
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tutorial.ipynb	5 days ago
Untitled.ipynb	7 days ago

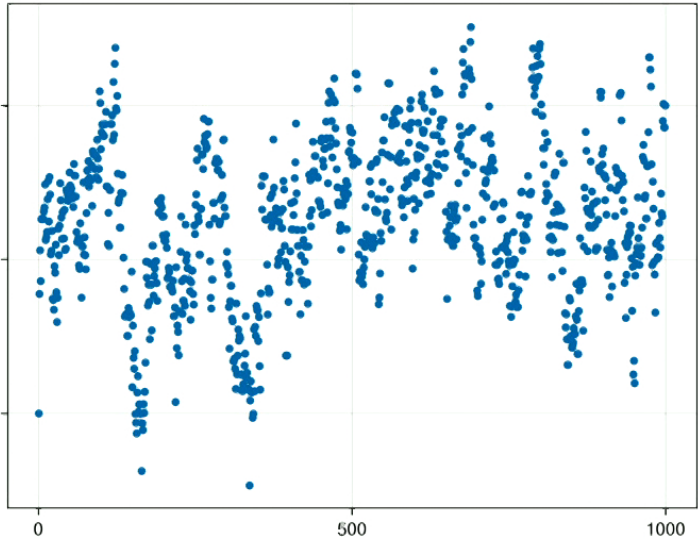
Terminal 2 x MCMC-homewo x Untitled4.ipynb x perlmutter99-jul x MCMC-filled-in. x Notes-from-clas x p99-data.txt x Notes-from-clas

Code

Julia 1.9.3



```
[117]: plot(chain[1:10:end, 2])
```



```
[97]: hexbin(chain[:,1], chain[:,2])
```

```
[97]:
```

Simple 2 7 Julia 1.9.3 | Idle Mode: Command Ln 1, Col 31 Notes-from-class.ipynb

https://symmetry.pi.local/user/dlang/lab/workspaces/auto-w/tree/home/dlang/FittingAModel2024/Notes-from-class.ipynb

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Filter files by name

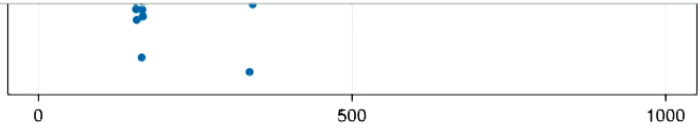
/ ... / dlang / FittingAModel2024 /

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data.csv	8 days ago
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tutorial.ipynb	5 days ago
Untitled.ipynb	7 days ago

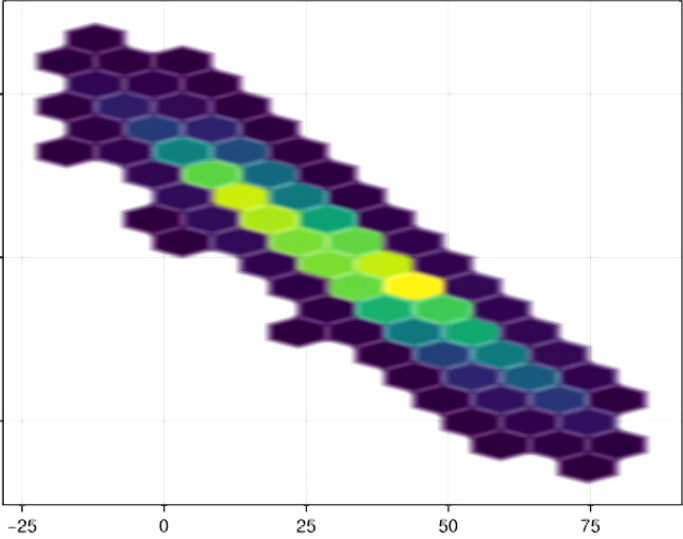
Terminal 2 x MCMC-homewo x Untitled4.ipynb x perlmutter99-jul x MCMC-filled-in. x Notes-from-clas x p99-data.txt x Notes-from-clas

Code

Julia 1.9.3



```
[97]: hexbin(chain[:,1], chain[:,2])
```



```
[90]: fig, ax, hm = heatmap(b_grid, m_grid, exp.(ll_grid))
Colorbar(fig[:, end+1], hm)
scatter!(b_opt, m_opt, color=:red)
fig
```

Simple 2 7 Julia 1.9.3 | Idle Mode: Edit Ln 1, Col 31 Notes-from-class.ipynb

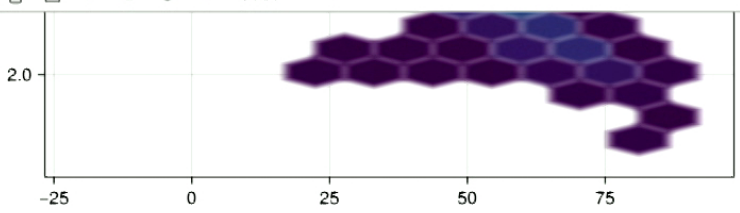
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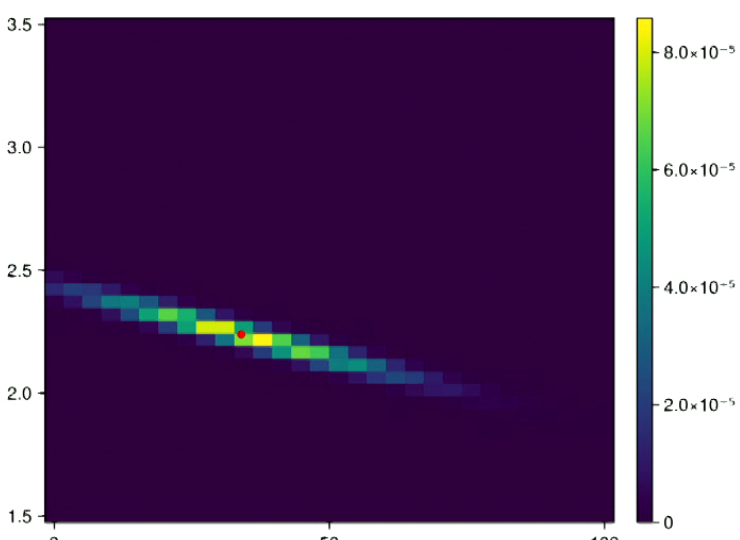
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Terminal 2 | MCMC-homewo | Untitled4.ipynb | perlmutter99-jul | MCMC-filled-in. | Notes-from-clas | p99-data.txt | Notes-from-clas

Code



```
[90]: fig, ax, hm = heatmap(b_grid, m_grid, exp.(ll_grid))
      Colorbar(fig[:, end+1], hm)
      scatter!(b_opt, m_opt, color=:red)
      fig
```



```
[90]:
```

Terminal 2 x MCMC-homewo x Untitled4.ipynb x perlmutter99-jul x MCMC-filled-in.l x Notes-from-clas x p99-data.txt x Notes-from-clas

Code Julia 1.9.3

```

@ /usr/share/applications/julia-1.9.3/share/julia/stdlib/v1.9/Pkg/src/Registry/Registry.jl:69
Installed ImageIO _____ v0.5.9
Installed WGLMakie _____ v0.4.2
Installed StatsFuns _____ v0.9.7
Installed ImageMagick _____ v1.3.0
Installed GR_jll _____ v0.69.1+0
Installed FFIW _____ v1.8.0
Installed TiffImages _____ v0.4.3
Installed PNGFiles _____ v0.3.17
Installed Hyperscript _____ v0.0.4
Installed PDMats _____ v0.10.1
Installed CEnum _____ v0.4.2
Installed PlotUtils _____ v1.2.0
Installed HTTP _____ v0.9.17
Installed StaticArrays _____ v0.12.6
Installed Contour _____ v0.5.7
Installed Media _____ v0.5.0
Installed Static _____ v0.3.3
Installed EllipsisNotation _____ v1.1.1
Installed Qt5Base_jll _____ v5.15.3+2
Installed Missings _____ v0.4.5
Installed Distances _____ v0.10.11
Installed DataFrames _____ v0.21.8
Installed SpecialFunctions _____ v0.10.3
Installed IfElse _____ v0.1.1
Installed NaNMath _____ v0.3.7
Installed PkgVersion _____ v0.1.1
Installed NLSolversBase _____ v7.5.0
Installed SnoopPrecompile _____ v1.0.3
Installed Loess _____ v0.6.3
Installed Gadfly _____ v1.4.0
Installed GR _____ v0.69.5
Installed ImageMagick_jll _____ v6.9.10-12+3
Installed Graphics _____ v1.1.2
Installed Compat _____ v2.2.1
Installed DataStructures _____ v0.17.20
Installed GridLayoutBase _____ v0.5.7
Installed JServe _____ v1.2.4
Installed StatsBase _____ v0.32.2
Installed StructTypes _____ v1.10.0
Installed WebSockets _____ v1.5.9
Installed ImageCore _____ v0.9.4

```

Simple 2 7 Julia 1.9.3 | Busy Mode: Edit Ln 1, Col 1 Notes-from-class.ipynb

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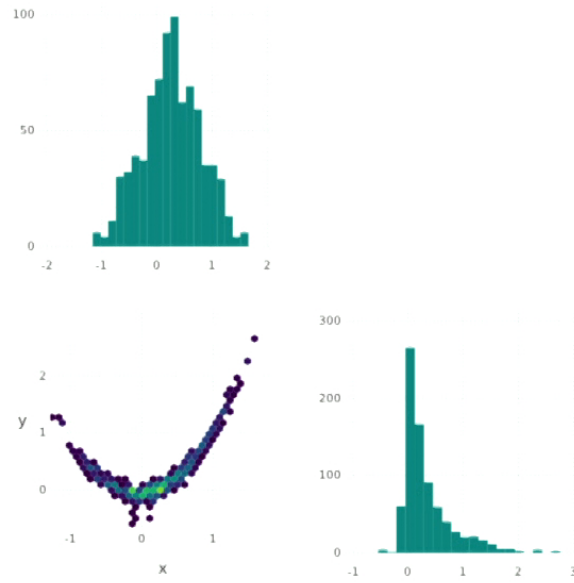
```
Terminal 2 | MCMC-homewo | Untitled4.ipynb | perlmutter99-jul | MCMC-filled-in. | Notes-from-clas | p99-data.txt | Notes-from-clas
Code
Julia 1.9.3
FreeType
OffsetArrays → OffsetArraysAdaptExt
LogExpFunctions
Distances → DistancesSparseArraysExt
MakieCore
IfElse
StructArrays
DataStructures
Loess
FFMPEG_jll
Qt5Base_jll
SpecialFunctions
Latexify
SortingAlgorithms
CategoricalArrays
Juno
Static
FFMPEG
ImageMagick_jll
QuadGK
HTTP
GR_jll
StaticArrays
DiffRules
WebSockets

[ ]: using CornerPlot
```


dimensions as a triangular matrix of subplots showing the samples in pairs of dimensions. To use make such a plot, simply call `corner` with an array of shape `(nsamples, ndims)` or a `DataFrame` containing your samples:

```
corner(df)
```

Further optional arguments can be seen in the example Julia notebook or in the docstrings of the code.



Required Packages



[Compat](#) >

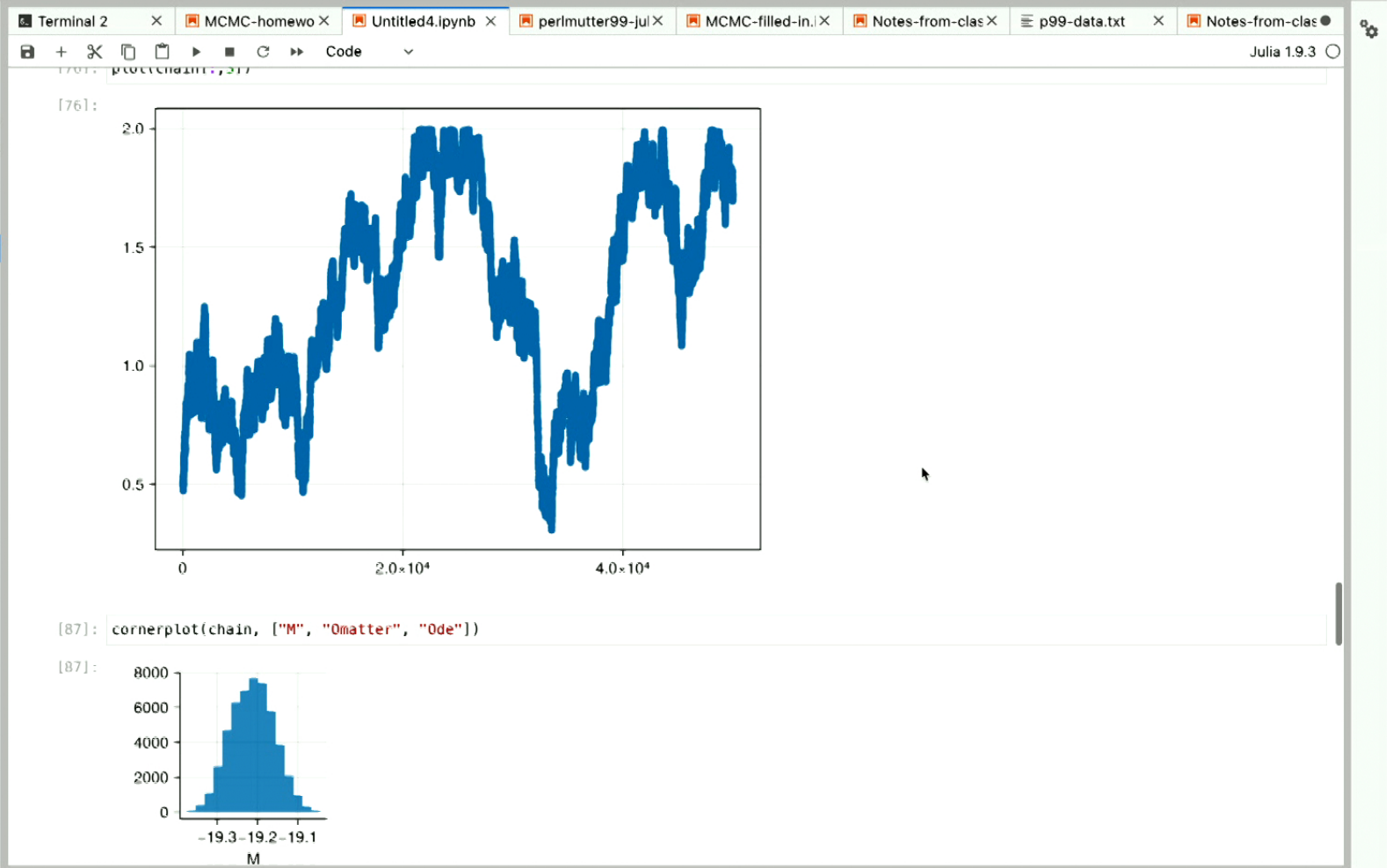
[Gadfly](#) >

Used By Packages

No packages found.

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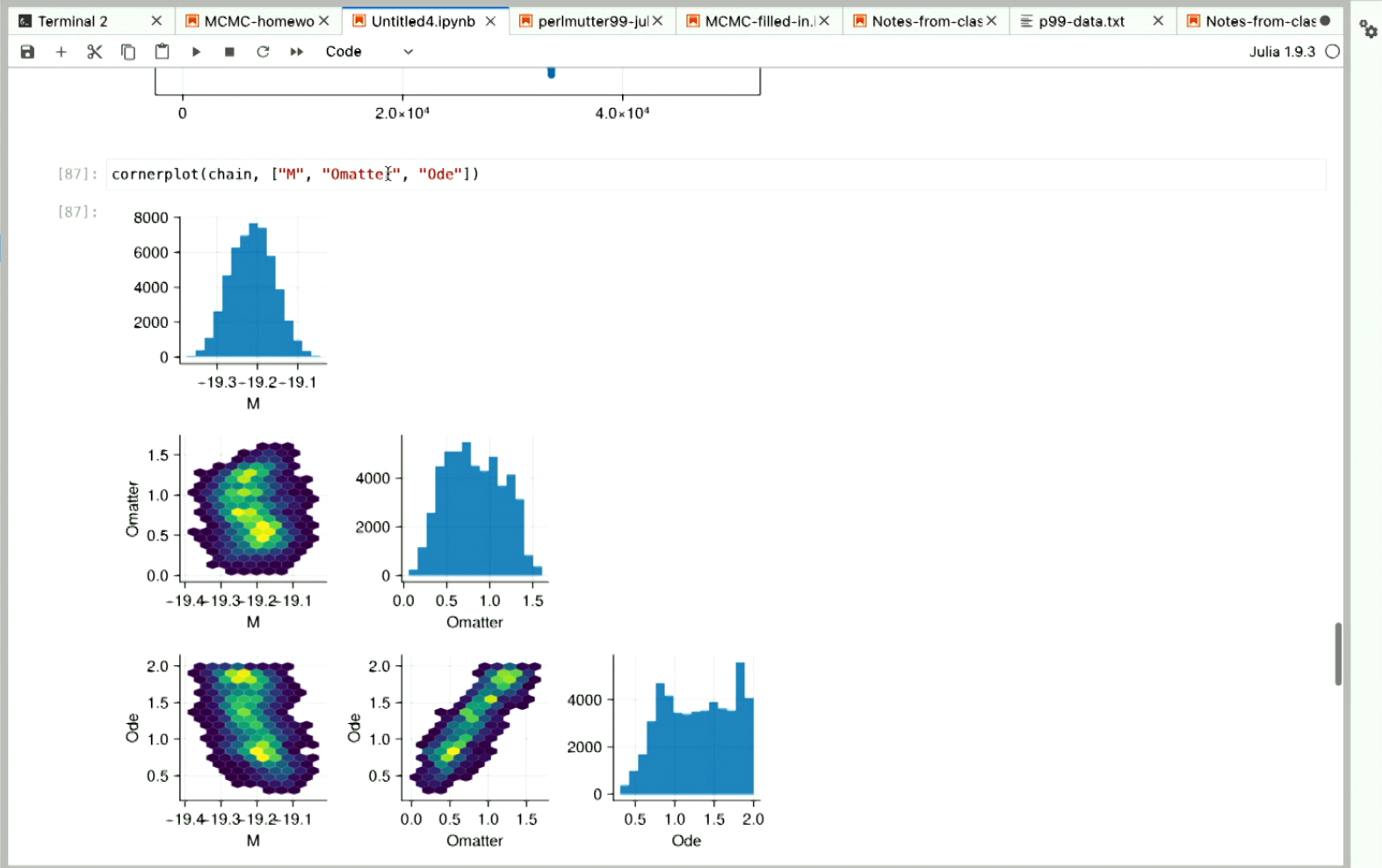
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Notes-from-class.ipynb	seconds ago
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tutorial.ipynb	5 days ago
Untitled.ipynb	7 days ago

```
end
# Equivalent to
# if ratio > rand():
chain[i, 1:end] = p
end
chain, n_accept ./ (n_steps ./ length(p))
end;
```

```
[67]: function propose(p, jump_sizes)
      p .+ randn(length(p)) .* jump_sizes
      end;
```

```
[115]: initial_guess = [20., 2.]
       jump_sizes = [10., 0.1]

       chain, accept_rate = mcmc(p -> log_likelihood(p, data.x, data.y, data.sigma_y),
                                p -> propose(p, jump_sizes),
                                initial_guess, 10000)
       @show accept_rate
       @show size(chain)

       accept_rate = [0.495, 0.3418]
       size(chain) = (10000, 2)

[115]: (10000, 2)
```

```
[116]: plot(chain[1:10:end, 1])

[116]:
```