

```
[1]: using Markdown
```

```
[2]: using LaTeXStrings, DifferentialEquations, LinearAlgebra, Plots, SparseArrays
```

```
[3]: using ForwardDiff
```

## 1 Self Activating Toggle Switch

*Add required function to implement model*

```
[4]: begin
      mma(x) = 1/(1+x)
      mmr(x) = 1/(1+1/x)
      hfr(n) = x -> 1/(1 + x^n)
      hfa(n) = x -> 1/(1 + (1/x)^n)
      hs( , n) = x-> hfr(n)(x) + * hfa(n)(x)
      hs( , n, x ) = x-> hs( , n)(x/x )
    end
```

```
[4]: hs (generic function with 2 methods)
```

*Implement model piecewise (separate production and degradation terms) for simulations and computation*

```
[5]: begin
      n = 4 # hill coefficient
      = 3 # for bistable
      = 10 # for tristable
      = 0.1 # repressor
      x = 80 # cutoff count bistable
      x = 25 # cutoff count tristable
      x = 20 # cutoff count repress
      p = 5 # unregulated production rate
      d = 0.1 # death rate
      proda(a,b) = p*hs( , n, x )(a)*hs( , n, x )(b)
      dega(a, b) = d*a
      dadt(a, b) = proda(a, b) - dega(a, b)
      prodb(a, b) = proda(b, a)
      degb(a, b) = d*b
```

```

        dbdt(a, b) = prodb(a,b) - degb(a, b)
        dfx = dadt
        dfy = dbdt
    end

```

[5]: dbdt (generic function with 1 method)

```

[6]: begin
        fx(x::Vector) = dfx(x[1], x[2])
        fy(x::Vector) = dfy(x[1], x[2])
        f(x::Vector) = [fx(x), fy(x)]
    end

```

[6]: f (generic function with 1 method)

*Run Helmholtz decomposition using ForwardDiff for the divergence*

```

[7]: begin
        # savefig(p_pot, "ch4_comp_pot.pdf")
        # savefig(p_rhs, "ch4_comp_rhs.pdf")
    end

```

*Compute Vector Field*

```

[8]: begin
        n_min = 0
        n_max = 550
    end

```

[8]: 550

```

[9]: begin
        dq = (n_max - n_min) / 10.
        xs = n_min:dq:n_max+1
        ys = n_min:dq:n_max+1

        dxs = n_min:.5:n_max+1
        dys = n_min:.5:n_max+1

        df(x, y) = normalize([dfx(x, y), dfy(x,y)]) .* 30
    end

```

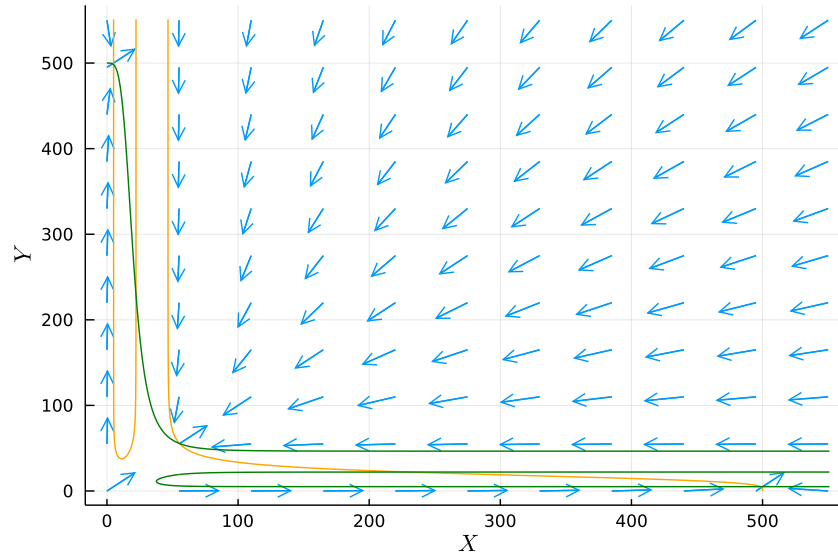
```

xxs = [x for x in xs for y in ys]
yys = [y for x in xs for y in ys]

quiver(xxs, yy, quiver=df)
contour!(dxx, dyy, dxx, levels=[0], color=:orange,
↳label="X Nullcline", colorbar = false)
contour!(dxx, dyy, dyy, levels=[0], color=:green,
↳label = "Y Nullcline", colorbar = false, xlabel=L"X",
↳ylabel=L"Y", legend=:topright,)
end

```

[9]:



```

[10]: begin
        random_count() = floor(Int, n_min + rand() * (n_max -
↳- n_min))
        rand_u0() = [random_count(), random_count()]
        u0 = rand_u0()
        u0 = [5, 500]
        t = (0.0, 30000.0)
    end

```

[10]: (0.0, 30000.0)

*Stochastic DiffEq of Langevin equation for this system*

```
[11]: begin
    function f(du, u, p, t)
        du[1] = dfx(u...)
        du[2] = dfy(u...)
        du[1], du[2]
    end

    g(du, u, p, t) = begin
        du[1,1] = sqrt(abs(proda(u[1], u[2])))
        du[1,2] = -sqrt(abs(degb(u[1], u[2])))
        du[1,3] = 0
        du[1,4] = 0
        du[2,1] = 0
        du[2,2] = 0
        du[2,3] = sqrt(abs(prodb(u[1], u[2])))
        du[2,4] = -sqrt(abs(degb(u[1], u[2])))
    end
end
```

[11]: g (generic function with 1 method)

```
[12]: begin

    minval = 1
    maxval = 505
    nsample = 256
    rhs_xs = range(minval, maxval, length=nsample)
    rhs_ys = range(minval, maxval, length=nsample)

    divergence(F::Function, pt) = sum(
        diag(
            ForwardDiff.jacobian(F, pt)
        )
    )
end
```

```

        rhs_new = [divergence(f, [x, y]) for x=rhs_xs,
↪y=rhs_ys]
end

```

[12]: 256×256 Matrix{Float64}:

```

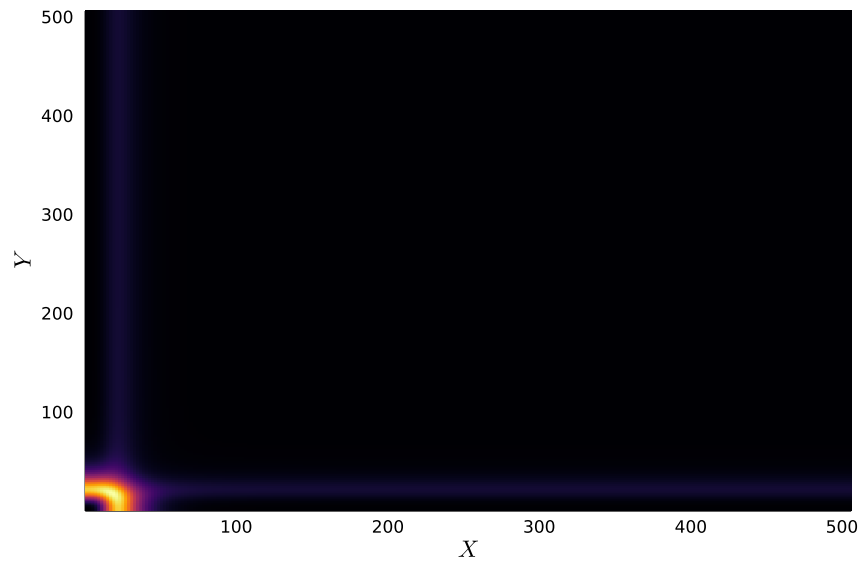
-0.199078 -0.187393 -0.143724 -0.048019 ... -0.
↪199952 -0.199952
-0.187393 -0.175718 -0.132103 -0.0365489 -0.
↪198783 -0.198783
-0.143724 -0.132103 -0.0887429 0.00611913 -0.
↪194416 -0.194416
-0.048019 -0.0365489 0.00611913 0.0991794 -0.
↪184845 -0.184845
0.115702 0.126852 0.168112 0.257596 -0.
↪168471 -0.168471
0.353829 0.364426 0.403307 0.486866 ... -0.
↪144656 -0.144656
0.656163 0.66594 0.701367 0.776451 -0.
↪114419 -0.11442
0.991237 0.99996 1.03101 1.09549 -0.
↪0809077 -0.0809078
1.30949 1.31701 1.34317 1.39599 -0.
↪0490778 -0.0490779
1.55691 1.56323 1.58454 1.62601 -0.
↪0243302 -0.0243303
1.69413 1.69934 1.71634 1.74792 ... -0.
↪0106041 -0.0106042
1.70966 1.71394 1.72742 1.75126 -0.
↪00904762 -0.00904771
1.61978 1.62331 1.63414 1.65243 -0.
↪0180329 -0.0180329
↪
↪
-0.199951 -0.198783 -0.194416 -0.184844 -0.2 ↪
↪ -0.2
-0.199951 -0.198783 -0.194416 -0.184844 ... -0.2 ↪
↪ -0.2

```

-0.199951	-0.198783	-0.194416	-0.184844	-0.2	␣
↪	-0.2				
-0.199951	-0.198783	-0.194416	-0.184844	-0.2	␣
↪	-0.2				
-0.199951	-0.198783	-0.194416	-0.184845	-0.2	␣
↪	-0.2				
-0.199952	-0.198783	-0.194416	-0.184845	-0.2	␣
↪	-0.2				
-0.199952	-0.198783	-0.194416	-0.184845	...	-0.2 ␣
↪	-0.2				
-0.199952	-0.198783	-0.194416	-0.184845	-0.2	␣
↪	-0.2				
-0.199952	-0.198783	-0.194416	-0.184845	-0.2	␣
↪	-0.2				
-0.199952	-0.198783	-0.194416	-0.184845	-0.2	␣
↪	-0.2				
-0.199952	-0.198783	-0.194416	-0.184845	...	-0.2 ␣
↪	-0.2				

```
[13]: begin
      p_rhs = heatmap(rhs_xs, rhs_ys, rhs_new,␣
      ↪xlabel=L"X", ylabel=L"Y", colorbar=:none)
      end
```

[13]:



```
[14]: begin
      sde_prob_ssa= SDEProblem(f, g, u0, t,
      ↪noise_rate_prototype=zeros(2,4))
      sde_sol = solve(sde_prob_ssa)
    end
```

```
Warning: dt <= dtmin. Aborting. There is either an error in
↪your model
specification or the true solution is unstable.
@ SciMLBase
/Users/bsm/.julia/packages/SciMLBase/FFFG1/src/
↪integrator_interface.jl:345
```

```
[14]: retcode: DtLessThanMin
Interpolation: 1st order linear
t: 86999-element Vector{Float64}:
 0.0
 2.910508956835909e-7
 6.184831533276307e-7
 9.868444431771756e-7
```

1.4012508942579135e-6  
1.8674581517237437e-6  
2.3919413163728028e-6  
2.981984876602994e-6  
3.6457838818619595e-6  
4.392557762778295e-6  
5.232678378809173e-6  
6.177814071843911e-6  
7.241091726507992e-6

23542.178575796537  
23542.360200730658  
23542.564528781546  
23542.794397838796  
23543.0530005282  
23543.32353513031  
23543.62385721609  
23543.941567437698  
23544.298991437005  
23544.701093436222  
23545.036843327278  
23545.12194082928

u: 86999-element Vector{Vector{Vector{Float64}}}:

[5.0, 500.0]  
[4.998445499790408, 499.99895879479806]  
[4.997974996095271, 500.00155249337115]  
[4.993974986150907, 499.9925236185461]  
[4.99456314914844, 499.98940826985404]  
[4.987631615670938, 499.98308519113345]  
[4.979020646960344, 499.988146432747]  
[4.979027603686411, 499.9933952524822]  
[4.983127921293282, 500.00367991927766]  
[4.9852627746511535, 499.9891290717687]  
[4.978592030023531, 499.9830865840751]  
[4.990949022250143, 499.97542770348434]  
[4.9873859164715775, 499.9880802729246]

[509.6778883567199, 2.515676347317035]  
[507.92930830626113, 2.2390995128380506]



```
[513.1970347842835, 2.6736502613242403]
[514.0679974631289, 1.980974826003427]
[513.9293820330126, 1.4510163072278337]
[506.6417203506271, 1.1809938031997163]
[505.4938321605557, 0.7786902100306531]
[508.8772868291129, 0.8460896694666321]
[503.7106289597263, 0.7714335774043232]
[500.3387980805558, 0.8522335110572933]
[494.907105494683, 0.4419863327350493]
[494.99057935601473, 0.2933383726336846]
```

```
[15]: sde_plot = plot(sde_sol, vars=[(1, 2)], xlabel=L"X",
    ↳ ylabel=L"Y", legend=:none)
    savefig(sde_plot, "SATS_sde_plot.pdf")
```

*Gillespie Jump Process formulation for the same problem*

```
[16]: begin
    proda!(integrator) = integrator.u[1] += 1
    prodb!(integrator) = integrator.u[2] += 1
    dega!(integrator) = integrator.u[1] -= 1
    degb!(integrator) = integrator.u[2] -= 1
    jumps = Dict{proda => proda!, prodb => prodb!, dega
    ↳ => dega!, degb => degb!}
    constJumps = []
    for (rate, jump) in jumps
        push!(constJumps, ConstantRateJump((u, p, t)
    ↳ -> rate(u...), jump))
    end
    constJumps
end
```

```
[16]: 4-element Vector{Any}:
  ConstantRateJump{var"#17#18"{typeof(proda)}},
  typeof(proda!){var"#17#18"{typeof(proda)}(proda), proda!}
  ConstantRateJump{var"#17#18"{typeof(prodb)}},
  typeof(prodb!){var"#17#18"{typeof(prodb)}(prodb), prodb!}
  ConstantRateJump{var"#17#18"{typeof(degb)}},
  typeof(degb!){var"#17#18"{typeof(degb)}(degb), degb!}
```

```
ConstantRateJump{var"#17#18"{typeof(dega)},  
typeof(dega!)}(var"#17#18"{typeof(dega)}(dega), dega!)
```

```
[17]: begin  
      dprob_ssa = DiscreteProblem(u0, t)  
      jprob_ssa = JumpProblem(dprob_ssa, Direct(),  
      ↪constJumps...)  
end
```

```
[17]:  
Number of constant rate jumps: 4  
Number of variable rate jumps: 0
```

```
[18]: ssa_sol = solve(jprob_ssa, SSAS stepper())
```

```
[18]: retcode: Default  
Interpolation: Piecewise constant interpolation  
t: 2988833-element Vector{Float64}:  
 0.0  
 0.024071853846978065  
 0.0327441707559156  
 0.04583388690915828  
 0.053568418325886526  
 0.05794376413794675  
 0.06908809325132233  
 0.06921299584568397  
 0.0960160332234628  
 0.11683317974055703  
 0.11790643564601012  
 0.12368853279393327  
 0.1275023979197143  
  
29999.808281144095  
29999.809659479415  
29999.81150217346  
29999.836692508652  
29999.84321426462  
29999.85148324632
```

```
29999.866360965807
29999.889562441207
29999.933240361588
29999.986323294124
29999.997285986006
30000.0
```

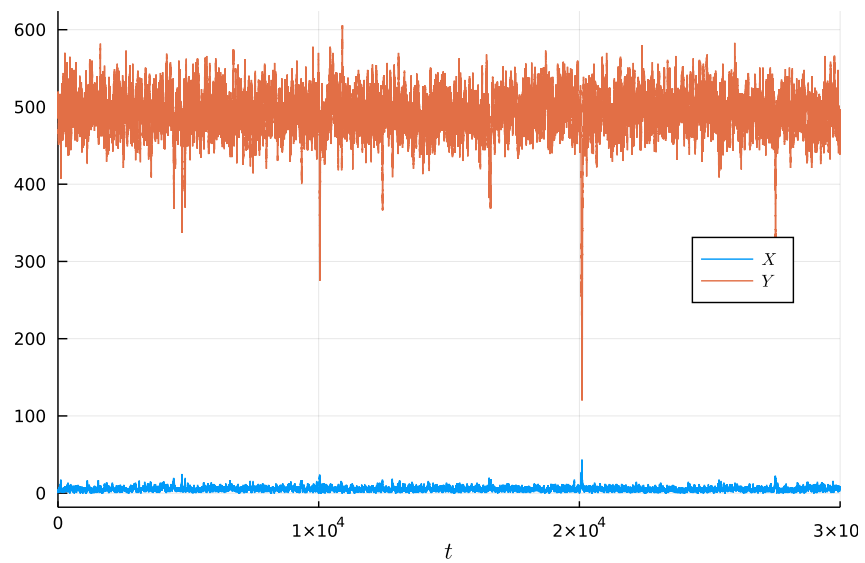
```
u: 2988833-element Vector{Vector{Int64}}:
```

```
[5, 500]
[5, 501]
[5, 500]
[5, 499]
[5, 498]
[5, 499]
[5, 498]
[5, 499]
[5, 500]
[5, 501]
[5, 500]
[5, 501]
[5, 502]
```

```
[6, 488]
[6, 489]
[6, 488]
[6, 487]
[6, 488]
[6, 489]
[6, 490]
[6, 489]
[6, 488]
[6, 487]
[6, 486]
[6, 486]
```

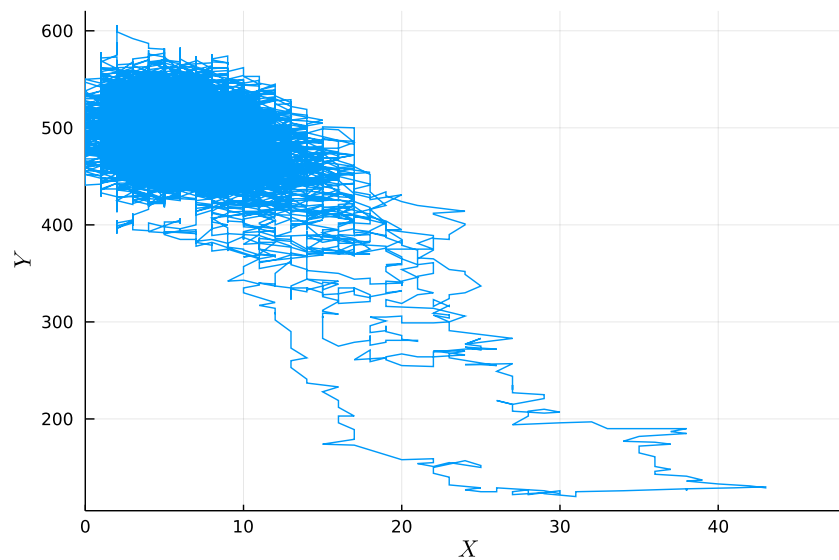
```
[19]: stoch_tri = plot(ssa_sol, labels=[L"X" L"Y"], xlabel=L"t",  
↳ legend=(0.9, 0.5))
```

```
[19]:
```



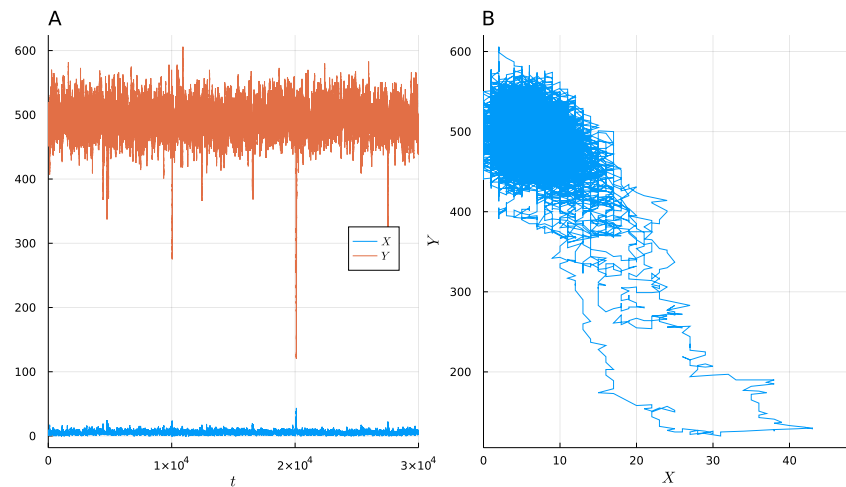
```
[20]: stoch_tri3 = plot(ssa_sol, vars=[(1, 2)], xlabel=L"X",
    ↪ylabel=L"Y", legend=:none)
```

[20]:



```
[21]: pstoch = plot(stoch_tri, stoch_tri3, layout=(1, 2),
↳size=(900, 500), title = ["A" "B"], titlelocation = :left)
```

```
[21]:
```



```
[22]: # savefig(pstoch, "ch4_tri_stoch.pdf")
```

*Setup helper functions for running longer simulations*

```
[23]: function get_u0(i)
    offset = 1.0
    new_u0 = [0.0, 0.0]
    if i % 3 == 0
        new_u0 = [55, 55]
    elseif i % 3 == 1
        new_u0 .+= [5, 500]
    elseif i % 3 == 2
        new_u0 .+= [500, 5]
    end
    new_u0
end
```

```
[23]: get_u0 (generic function with 1 method)
```

```
[24]: # savefig(ps, "ch4_ad_hoc.pdf")
```

Helper function to generate -  $\Delta$  to solve the Helmholtz equation

```
[25]: begin
        eye(N, M) = sparse(I, N, M)
        eye(M) = eye(M, M)
        diff1(M) = [ [1.0 zeros(1, M - 1)]; diagm(1 =>
        ↪ ones(M - 1)) - eye(M) ]
        sdiff1(M) = sparse(diff1(M))

        # make the discrete -Laplacian in 2d, with Dirichlet
        ↪ boundaries
        function laplacian2d(Nx, Ny, Lx, Ly)
            dx = Lx / (Nx + 1)
            dy = Ly / (Ny + 1)
            Dx = sdiff1(Nx) / dx
            Dy = sdiff1(Ny) / dy
            Ax = Dx' * Dx
            Ay = Dy' * Dy
            return Dx, Dy, kron(eye(Ny), Ax) + kron(Ay,
            ↪ eye(Nx))
        end
    end
```

```
[25]: laplacian2d (generic function with 1 method)
```

```
[26]: begin
        _, _, Δ = laplacian2d(nsamples, nsamples, maxval -
        ↪ minval, maxval - minval)
        sol = reshape(Δ \ reshape(rhs_new, length(rhs_new)),
        ↪ size(rhs_new)...)
    end
```

```
[26]: 256×256 Matrix{Float64}:
      2.43212    5.24705    8.33599  ...  -5.38033   -3.85295  ↪
      ↪ -2.11273
      5.24705   10.9408    16.9724    -10.1287   -7.14974  ↪
      ↪ -3.829
```

8.33599	16.9724	25.8132		-14.3517	-10.0239	␣
↪-5.28902						
11.6773	23.3077	34.8246		-18.1302	-12.5573	␣
↪-6.55551						
15.25	29.897	43.9402		-21.5325	-14.8086	␣
↪-7.66486						
18.9807	36.6024	52.9804	...	-24.6278	-16.8317	␣
↪-8.64743						
22.7098	43.1499	61.6013		-27.4953	-18.6869	␣
↪-9.5368						
26.1849	49.125	69.2949		-30.2262	-20.4437	␣
↪-10.3728						
29.0928	54.0244	75.4539		-32.9186	-22.1777	␣
↪-11.1996						
31.1257	57.3611	79.4972		-35.6641	-23.9601	␣
↪-12.0593						
32.0611	58.7851	81.0125	...	-38.534	-25.8457	␣
↪-12.9839						
31.8182	58.1704	79.8576		-41.5677	-27.8638	␣
↪-13.99						
30.4662	55.6291	76.1784		-44.7712	-30.0171	␣
↪-15.0775						
-15.732	-30.7192	-44.9899		-57.312	-38.9096	␣
↪-19.819						
-14.7362	-28.7298	-42.011	...	-53.6836	-36.4846	␣
↪-18.6046						
-13.714	-26.6883	-38.9555		-49.9246	-33.9713	␣
↪-17.3457						
-12.6627	-24.5893	-35.8159		-46.0225	-31.3611	␣
↪-16.0379						
-11.5784	-22.4259	-32.5829		-41.9624	-28.6434	␣
↪-14.6757						
-10.4561	-20.1885	-29.2437		-37.7261	-25.8053	␣
↪-13.2523						
-9.28854	-17.8638	-25.7807	...	-33.2908	-22.8302	␣
↪-11.7589						

```

-8.06529 -15.4329 -22.1697 -28.6277 -19.6966
↪-10.184
-6.77073 -12.8683 -18.3765 -23.699 -16.3753
↪-8.51129
-5.38033 -10.1287 -14.3517 -18.4544 -12.8253
↪-6.71668
-3.85295 -7.14974 -10.0239 -12.8253 -8.98543
↪-4.76102
-2.11273 -3.829 -5.28902 ... -6.71668 -4.76102
↪-2.5728

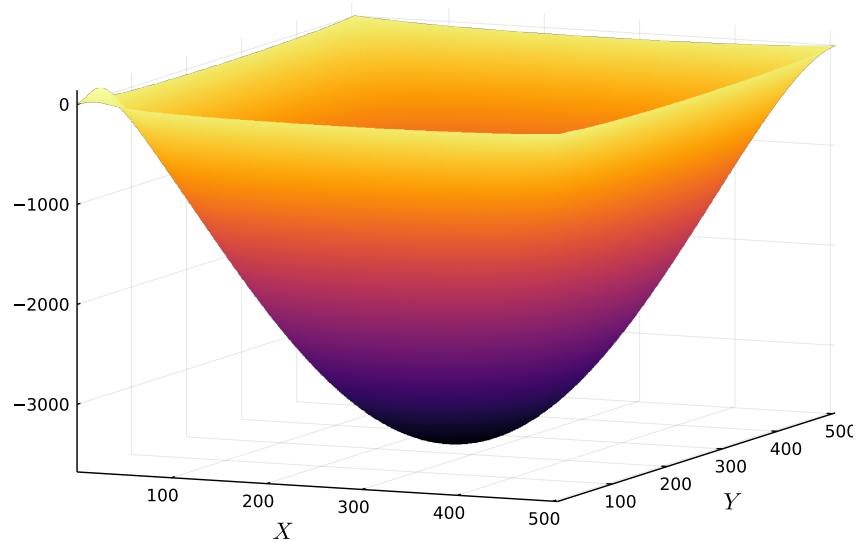
```

```

[27]: p_pot = surface(rhs_xs, rhs_ys, sol, xlabel=L"X",
↪ylabel=L"Y", colorbar=:none)

```

[27]:



*Helper function to compute 2D histograms for Probability distributions*

```

[28]: begin
      nbins = 701
      bin_min = 0
      bin_max = 700

```



```

xbins = range(bin_min, bin_max, length=nbins)
ybins = range(bin_min, bin_max, length=nbins)

function bucket_idx(val, vec)
    idx = 1
    while val > vec[idx]
        idx += 1
    end
    idx
end

function althist(x, y, dt, xedges, yedges)
    counts = spzeros(length(yedges)-1,
↳length(xedges)-1)
    for i=1:length(x) - 1
        r = bucket_idx(y[i], yedges)
        c = bucket_idx(x[i], xedges)
        counts[r,c] += dt[i]
    end
    counts
end

end

```

[28]: althist (generic function with 1 method)

*Storage for unnormalized probabilities that sum up the  $dt$ s in each bin*

```

[29]: begin
        unnorm_ssa = spzeros(length(xbins)-1,
↳length(ybins)-1)
        unnorm_sde = spzeros(length(xbins)-1,
↳length(ybins)-1)
        tspan = (0., 5e4)
    end

```

[29]: (0.0, 50000.0)

*Rerun the following cell to add more values to the SSA simulation*

```

[30]: begin
        global n_points_sim
        for i in 1:3*10
            long_jprob_ssa = JumpProblem(
                DiscreteProblem(get_u0(i), tspan),
                Direct(), constJumps...)
            long_ssa_sol = solve(long_jprob_ssa,
                SSAS stepper())
            unnorm_ssa .+= althist(long_ssa_sol[1,:],
                long_ssa_sol[2, :], diff(long_ssa_sol.t[:]), xbins, ybins)
        end
        unnorm_ssa
    end

```

```

[30]: 700×700 SparseMatrixCSC{Float64, Int64} with 31740 stored
        entries:

```

*Rerun the following cell to have the SDE simulation catch up to the SSA*

```

[31]: begin
        i = 1
        num_sde_run_failures = 0
        while sum(unnorm_sde) < sum(unnorm_ssa)
            global i
            global num_sde_run_failures

            sde_run = SDEProblem(f, g, get_u0(i), tspan,
↳noise_rate_prototype=zeros(2,4))
            sol = solve(sde_prob_ssa)

            if sol.t[end] < tspan[end]
                # the simulation did not complete
↳successfully.
                # This is a sign of divergence and a
↳failing approximation
                num_sde_run_failures += 1
            end
            unnorm_sde .+= althist(sol[1,:], sol[2, :],
↳diff(sol.t[:]), xbins, ybins)
            i += 1
        end
        unnorm_sde, num_sde_run_failures, i
    end

```

```

Warning: dt <= dtmin. Aborting. There is either an error in
↳your model
specification or the true solution is unstable.
@ SciMLBase
/Users/bsm/.julia/packages/SciMLBase/FFFG1/src/
↳integrator_interface.jl:345
Warning: dt <= dtmin. Aborting. There is either an error in
↳your model
specification or the true solution is unstable.
@ SciMLBase
/Users/bsm/.julia/packages/SciMLBase/FFFG1/src/
↳integrator_interface.jl:345

```

[illegible]

[illegible]

[illegible]

[illegible]

[illegible]



```
@ SciMLBase
/Users/bism/.julia/packages/SciMLBase/EFFG1/src/
↳integrator_interface.jl:345
Warning: dt <= dtmin. Aborting. There is either an error in
↳your model
specification or the true solution is unstable.
@ SciMLBase
/Users/bism/.julia/packages/SciMLBase/EFFG1/src/
↳integrator_interface.jl:345
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↳your model
specification or the true solution is unstable.
```

[illegible]

[illegible]

[illegible]

[illegible]



, 93, 94)

```
[32]: prob_ssa = unnorm_ssa ./ sum(unnorm_ssa)
```

```
[32]: 700×700 SparseMatrixCSC{Float64, Int64} with 31740 stored  
      ↪ entries:
```

```
[39]: prob_sde = unnorm_sde ./ sum(unnorm_sde)
```

```
[39]: 700×700 SparseMatrixCSC{Float64, Int64} with 33705 stored_  
      ↪ entries:
```

*the SDE probability distribution is complete non-sense*

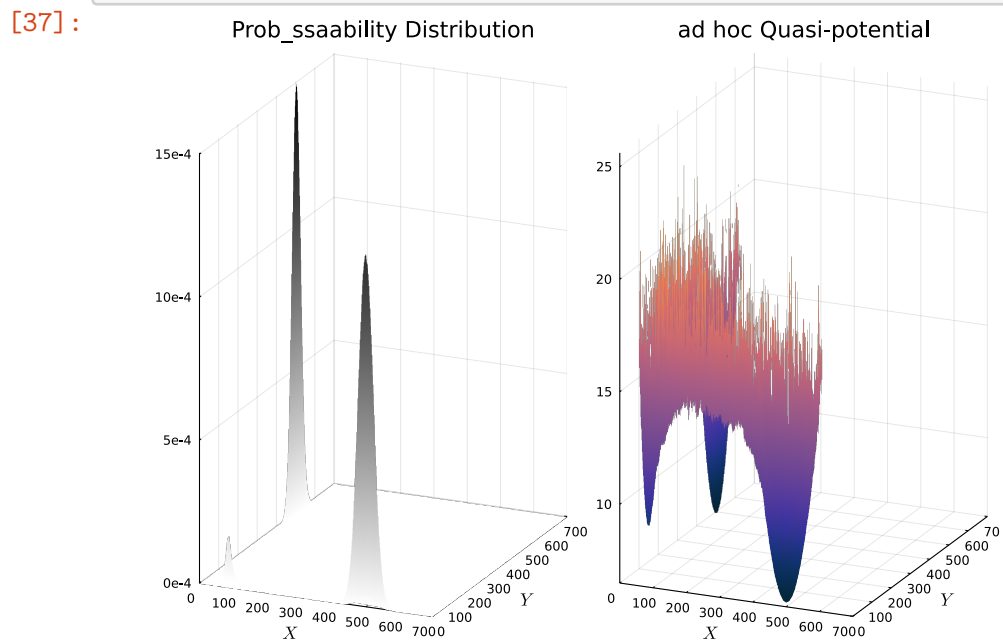
```
[40]: begin  
      plotly()  
      pl = surface(prob_sde, xlabel="X", ylabel="Y")  
      gr()  
      pl  
      end
```

```
[35]: begin  
      xplot = range(bin_min, bin_max, length=nbins-1)  
      yplot = range(bin_min, bin_max, length=nbins-1)  
      end
```

```
[35]: 0.0:1.0014306151645207:700.0
```



```
[37]: begin
      pp1 = surface(xplot, yplot, -log.(prob_ssa), c = :
      ↪thermal, title="ad hoc Quasi-potential")
      pp2 = surface(xplot, yplot, prob_ssa, c = :grayC,
      ↪title="Prob_ssaability Distribution",
      ↪zaxis=(formatter=y->string(round(Int, y / 10^-4))*"e-4" ),
      ↪)
      ps = plot(pp2, pp1, layout =(1, 2), size=(800, 600),
      ↪xlabel=L"X", ylabel=L"Y", colorbar=:none)
end
```



[ ]: