

POLLU Work-Precision Diagrams

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```
using OrdinaryDiffEq, DiffEqDevTools, Sundials, ParameterizedFunctions, Plots, ODE,  
ODEInterfaceDiffEq, LSODA
```

```
Error: Failed to precompile OrdinaryDiffEq [1dea7af3-3e70-54e6-95c3-0bf5283  
fa5ed] to /builds/JuliaGPU/DiffEqBenchmarks.jl/.julia/compiled/v1.4/Ordinar  
yDiffEq/DlSvy_YAMOL.ji.
```

```
gr() # gr(fmt=:png)
```

```
Error: UndefVarError: gr not defined
```

```
using LinearAlgebra  
LinearAlgebra.BLAS.set_num_threads(1)
```

```
const k1=.35e0  
const k2=.266e2  
const k3=.123e5  
const k4=.86e-3  
const k5=.82e-3  
const k6=.15e5  
const k7=.13e-3  
const k8=.24e5  
const k9=.165e5  
const k10=.9e4  
const k11=.22e-1  
const k12=.12e5  
const k13=.188e1  
const k14=.163e5  
const k15=.48e7  
const k16=.35e-3  
const k17=.175e-1  
const k18=.1e9  
const k19=.444e12  
const k20=.124e4  
const k21=.21e1  
const k22=.578e1  
const k23=.474e-1  
const k24=.178e4  
const k25=.312e1
```

```
function f(dy,y,p,t)  
  r1 = k1 *y[1]  
  r2 = k2 *y[2]*y[4]  
  r3 = k3 *y[5]*y[2]  
  r4 = k4 *y[7]
```

```

r5 = k5 *y[7]
r6 = k6 *y[7]*y[6]
r7 = k7 *y[9]
r8 = k8 *y[9]*y[6]
r9 = k9 *y[11]*y[2]
r10 = k10*y[11]*y[1]
r11 = k11*y[13]
r12 = k12*y[10]*y[2]
r13 = k13*y[14]
r14 = k14*y[1]*y[6]
r15 = k15*y[3]
r16 = k16*y[4]
r17 = k17*y[4]
r18 = k18*y[16]
r19 = k19*y[16]
r20 = k20*y[17]*y[6]
r21 = k21*y[19]
r22 = k22*y[19]
r23 = k23*y[1]*y[4]
r24 = k24*y[19]*y[1]
r25 = k25*y[20]

dy[1] = -r1-r10-r14-r23-r24+
        r2+r3+r9+r11+r12+r22+r25
dy[2] = -r2-r3-r9-r12+r1+r21
dy[3] = -r15+r1+r17+r19+r22
dy[4] = -r2-r16-r17-r23+r15
dy[5] = -r3+r4+r4+r6+r7+r13+r20
dy[6] = -r6-r8-r14-r20+r3+r18+r18
dy[7] = -r4-r5-r6+r13
dy[8] = r4+r5+r6+r7
dy[9] = -r7-r8
dy[10] = -r12+r7+r9
dy[11] = -r9-r10+r8+r11
dy[12] = r9
dy[13] = -r11+r10
dy[14] = -r13+r12
dy[15] = r14
dy[16] = -r18-r19+r16
dy[17] = -r20
dy[18] = r20
dy[19] = -r21-r22-r24+r23+r25
dy[20] = -r25+r24
end

function fjac(J,y,p,t)
    J .= 0.0
    J[1,1] = -k1-k10*y[11]-k14*y[6]-k23*y[4]-k24*y[19]
    J[1,11] = -k10*y[1]+k9*y[2]
    J[1,6] = -k14*y[1]
    J[1,4] = -k23*y[1]+k2*y[2]
    J[1,19] = -k24*y[1]+k22
    J[1,2] = k2*y[4]+k9*y[11]+k3*y[5]+k12*y[10]
    J[1,13] = k11
    J[1,20] = k25
    J[1,5] = k3*y[2]
    J[1,10] = k12*y[2]

    J[2,4] = -k2*y[2]

```

```

J[2,5]    = -k3*y[2]
J[2,11]   = -k9*y[2]
J[2,10]   = -k12*y[2]
J[2,19]   = k21
J[2,1]    = k1
J[2,2]    = -k2*y[4]-k3*y[5]-k9*y[11]-k12*y[10]

J[3,1]    = k1
J[3,4]    = k17
J[3,16]   = k19
J[3,19]   = k22
J[3,3]    = -k15

J[4,4]    = -k2*y[2]-k16-k17-k23*y[1]
J[4,2]    = -k2*y[4]
J[4,1]    = -k23*y[4]
J[4,3]    = k15

J[5,5]    = -k3*y[2]
J[5,2]    = -k3*y[5]
J[5,7]    = 2k4+k6*y[6]
J[5,6]    = k6*y[7]+k20*y[17]
J[5,9]    = k7
J[5,14]   = k13
J[5,17]   = k20*y[6]

J[6,6]    = -k6*y[7]-k8*y[9]-k14*y[1]-k20*y[17]
J[6,7]    = -k6*y[6]
J[6,9]    = -k8*y[6]
J[6,1]    = -k14*y[6]
J[6,17]   = -k20*y[6]
J[6,2]    = k3*y[5]
J[6,5]    = k3*y[2]
J[6,16]   = 2k18

J[7,7]    = -k4-k5-k6*y[6]
J[7,6]    = -k6*y[7]
J[7,14]   = k13

J[8,7]    = k4+k5+k6*y[6]
J[8,6]    = k6*y[7]
J[8,9]    = k7

J[9,9]    = -k7-k8*y[6]
J[9,6]    = -k8*y[9]

J[10,10]  = -k12*y[2]
J[10,2]   = -k12*y[10]+k9*y[11]
J[10,9]   = k7
J[10,11]  = k9*y[2]

J[11,11]  = -k9*y[2]-k10*y[1]
J[11,2]   = -k9*y[11]
J[11,1]   = -k10*y[11]
J[11,9]   = k8*y[6]
J[11,6]   = k8*y[9]
J[11,13]  = k11

J[12,11]  = k9*y[2]

```

```

J[12,2] = k9*y[11]

J[13,13] = -k11
J[13,11] = k10*y[1]
J[13,1] = k10*y[11]

J[14,14] = -k13
J[14,10] = k12*y[2]
J[14,2] = k12*y[10]

J[15,1] = k14*y[6]
J[15,6] = k14*y[1]

J[16,16] = -k18-k19
J[16,4] = k16

J[17,17] = -k20*y[6]
J[17,6] = -k20*y[17]

J[18,17] = k20*y[6]
J[18,6] = k20*y[17]

J[19,19] = -k21-k22-k24*y[1]
J[19,1] = -k24*y[19]+k23*y[4]
J[19,4] = k23*y[1]
J[19,20] = k25

J[20,20] = -k25
J[20,1] = k24*y[19]
J[20,19] = k24*y[1]

return
end

u0 = zeros(20)
u0[2] = 0.2
u0[4] = 0.04
u0[7] = 0.1
u0[8] = 0.3
u0[9] = 0.01
u0[17] = 0.007
prob = ODEProblem(ODEFunction(f, jac=fjac),u0,(0.0,60.0))

Error: UndefVarError: ODEFunction not defined

sol = solve(prob,Rodas5(), abstol=1/10^14, reltol=1/10^14)

Error: UndefVarError: Rodas5 not defined

test_sol = TestSolution(sol)

Error: UndefVarError: TestSolution not defined

abstols = 1.0 ./ 10.0 .^ (4:11)
reltols = 1.0 ./ 10.0 .^ (1:8);

8-element Array{Float64,1}:
 0.1
 0.01
 0.001

```

```
0.0001
1.0e-5
1.0e-6
1.0e-7
1.0e-8
```

```
plot(sol)
```

```
Error: UndefVarError: plot not defined
```

```
plot(sol, tspan=(0.0, 5.0))
```

```
Error: UndefVarError: plot not defined
```

0.1 Omissions

The following were omitted from the tests due to convergence failures. ODE.jl's adaptivity is not able to stabilize its algorithms, while GeometricIntegratorsDiffEq has not upgraded to Julia 1.0. GeometricIntegrators.jl's methods used to be either fail to converge at comparable dts (or on some computers errors due to type conversions).

```
#sol = solve(prob, ode23s()); println("Total ODE.jl steps: $(length(sol))")
#using GeometricIntegratorsDiffEq
#try
#    sol = solve(prob, GIRadIIA3(), dt=1/10)
#catch e
#    println(e)
#end
```

The stabilized explicit methods fail.

```
setups = [
    Dict{alg=>ROCK2()},
    Dict{alg=>ROCK4()},
    Dict{alg=>ESERK5()}
]
```

```
0-element Array{Any,1}
```

The EPIRK and exponential methods also fail:

```
sol = solve(prob, EXPRB53s3(), dt=2.0^(-8));
```

```
Error: UndefVarError: EXPRB53s3 not defined
```

```
sol = solve(prob, EPIRK4s3B(), dt=2.0^(-8));
```

```
Error: UndefVarError: EPIRK4s3B not defined
```

```
sol = solve(prob, EPIRK5P2(), dt=2.0^(-8));
```

```
Error: UndefVarError: EPIRK5P2 not defined
```

0.2 High Tolerances

This is the speed when you just want the answer.

```
abstols = 1.0 ./ 10.0 .^ (5:8)
reltols = 1.0 ./ 10.0 .^ (1:4);
setups = [Dict(:alg=>Rosenbrock23()),
          Dict(:alg=>Rodas3()),
          Dict(:alg=>TRBDF2()),
          Dict(:alg=>CVODE_BDF()),
          Dict(:alg=>rodas()),
          Dict(:alg=>radau()),
          Dict(:alg=>lsoda()),
          Dict(:alg=>RadauIIA5()),
          ]
```

Error: UndefVarError: Rosenbrock23 not defined

```
wp = WorkPrecisionSet(prob,abstols,reltols,setups;verbose=false,
                      save_everystep=false,appxsol=test_sol,maxiters=Int(1e5),numruns=10)
```

Error: UndefVarError: test_sol not defined

```
plot(wp)
```

Error: UndefVarError: plot not defined

```
wp = WorkPrecisionSet(prob,abstols,reltols,setups;dense = false,verbose = false,
                      appxsol=test_sol,maxiters=Int(1e5),error_estimate=:l2,numruns=10)
```

Error: UndefVarError: test_sol not defined

```
plot(wp)
```

Error: UndefVarError: plot not defined

```
wp = WorkPrecisionSet(prob,abstols,reltols,setups;verbose=false,
                      appxsol=test_sol,maxiters=Int(1e5),error_estimate=:L2,numruns=10)
```

Error: UndefVarError: test_sol not defined

```
plot(wp)
```

Error: UndefVarError: plot not defined

```
setups = [Dict(:alg=>Rosenbrock23()),
          Dict(:alg=>Kvaerno3()),
          Dict(:alg=>CVODE_BDF()),
          Dict(:alg=>KenCarp4()),
          Dict(:alg=>TRBDF2()),
          Dict(:alg=>KenCarp3()),
          Dict(:alg=>Rodas4()),
          Dict(:alg=>radau())]
```

Error: UndefVarError: Rosenbrock23 not defined

```
wp = WorkPrecisionSet(prob,abstols,reltols,setups;
                      save_everystep=false,appxsol=test_sol,maxiters=Int(1e5),numruns=10)
```

Error: UndefVarError: test_sol not defined

```

plot(wp)

Error: UndefinedVarError: plot not defined

wp = WorkPrecisionSet(prob, abstols, reltols, setups; dense = false, verbose = false,
                      appxsol=test_sol, maxiters=Int(1e5), error_estimate=:l2, numruns=10)

Error: UndefinedVarError: test_sol not defined

plot(wp)

Error: UndefinedVarError: plot not defined

wp = WorkPrecisionSet(prob, abstols, reltols, setups;
                      appxsol=test_sol, maxiters=Int(1e5), error_estimate=:L2, numruns=10)

Error: UndefinedVarError: test_sol not defined

plot(wp)

Error: UndefinedVarError: plot not defined

setups = [Dict{:alg=>Rosenbrock23()},
          Dict{:alg=>KenCarp5()},
          Dict{:alg=>KenCarp4()},
          Dict{:alg=>KenCarp3()},
          Dict{:alg=>ARKODE(order=5)},
          Dict{:alg=>ARKODE()},
          Dict{:alg=>ARKODE(order=3)}]

Error: UndefinedVarError: Rosenbrock23 not defined

names = ["Rosenbrock23" "KenCarp5" "KenCarp4" "KenCarp3" "ARKODE5" "ARKODE4" "ARKODE3"]
wp = WorkPrecisionSet(prob, abstols, reltols, setups;

names=names, save_everystep=false, appxsol=test_sol, maxiters=Int(1e5), numruns=10)

Error: UndefinedVarError: test_sol not defined

plot(wp)

Error: UndefinedVarError: plot not defined

setups = [Dict{:alg=>Rosenbrock23()},
          Dict{:alg=>TRBDF2()},
          Dict{:alg=>ImplicitEulerExtrapolation()},
          #Dict{:alg=>ImplicitDeufhardExtrapolation()}, # Diverges
          #Dict{:alg=>ImplicitHairerWannerExtrapolation()}, # Diverges
          Dict{:alg=>ABDF2()},
          #Dict{:alg=>QNDF()},
          Dict{:alg=>Exprb43()},
          Dict{:alg=>Exprb32()},
        ]

Error: UndefinedVarError: Rosenbrock23 not defined

wp = WorkPrecisionSet(prob, abstols, reltols, setups;
                      save_everystep=false, appxsol=test_sol, maxiters=Int(1e5))

Error: UndefinedVarError: test_sol not defined

plot(wp)

Error: UndefinedVarError: plot not defined

```

0.2.1 Low Tolerances

This is the speed at lower tolerances, measuring what's good when accuracy is needed.

```
abstols = 1.0 ./ 10.0 .^ (7:13)
reltols = 1.0 ./ 10.0 .^ (4:10)
```

```
setups = [Dict(:alg=>GRK4A()),
          Dict(:alg=>Rodas4P()),
          Dict(:alg=>CVODE_BDF()),
          Dict(:alg=>ddebdf()),
          Dict(:alg=>Rodas4()),
          Dict(:alg=>rodas()),
          Dict(:alg=>radau()),
          Dict(:alg=>lsoda())
        ]
```

Error: UndefVarError: GRK4A not defined

```
wp = WorkPrecisionSet(prob,abstols,reltols,setups;verbose=false,
                      save_everystep=false,appxsol=test_sol,maxiters=Int(1e5),numruns=10)
```

Error: UndefVarError: test_sol not defined

```
plot(wp)
```

Error: UndefVarError: plot not defined

```
wp = WorkPrecisionSet(prob,abstols,reltols,setups;verbose=false,
                      dense=false,appxsol=test_sol,maxiters=Int(1e5),error_estimate=:l2,numruns=10)
```

Error: UndefVarError: test_sol not defined

```
plot(wp)
```

Error: UndefVarError: plot not defined

```
wp = WorkPrecisionSet(prob,abstols,reltols,setups;verbose=false,
                      appxsol=test_sol,maxiters=Int(1e5),error_estimate=:L2,numruns=10)
```

Error: UndefVarError: test_sol not defined

```
plot(wp)
```

Error: UndefVarError: plot not defined

```
setups = [
          Dict(:alg=>Rodas5()),
          Dict(:alg=>Kvaerno4()),
          Dict(:alg=>Kvaerno5()),
          Dict(:alg=>CVODE_BDF()),
          Dict(:alg=>KenCarp4()),
          Dict(:alg=>KenCarp5()),
          Dict(:alg=>Rodas4()),
          Dict(:alg=>radau())
        ]
```

Error: UndefVarError: Rodas5 not defined

```
wp = WorkPrecisionSet(prob,abstols,reltols,setups;
                      save_everystep=false,appxsol=test_sol,maxiters=Int(1e5),numruns=10)
```



```
Error: UndefVarError: test_sol not defined
```

```
plot(wp)
```

```
Error: UndefVarError: plot not defined
```

```
wp = WorkPrecisionSet(prob, abstols, reltols, setups; verbose=false,  
dense=false, appxsol=test_sol, maxiters=Int(1e5), error_estimate=:l2, numruns=10)
```

```
Error: UndefVarError: test_sol not defined
```

```
plot(wp)
```

```
Error: UndefVarError: plot not defined
```

```
wp = WorkPrecisionSet(prob, abstols, reltols, setups;  
    appxsol=test_sol, maxiters=Int(1e5), error_estimate=:L2, numruns=10)
```

```
Error: UndefVarError: test_sol not defined
```

```
plot(wp)
```

```
Error: UndefVarError: plot not defined
```

The following algorithms were removed since they failed.

```
#setups = [#Dict(:alg=>Hairer4()),  
           #Dict(:alg=>Hairer42()),  
           #Dict(:alg=>Rodas3()),  
           #Dict(:alg=>Cash4())  
#]  
#wp = WorkPrecisionSet(prob, abstols, reltols, setups;  
#  
#save_everystep=false, appxsol=test_sol, maxiters=Int(1e5), numruns=10)  
#plot(wp)
```

0.2.2 Conclusion

Sundials CVODE_BDF the best here. lsoda does well at high tolerances but then grows fast when tolerances get too low. KenCarp4 or Rodas5 is a decent substitute when necessary.

```
using SciMLBenchmarks  
SciMLBenchmarks.bench_footer(WEAVE_ARGS[:folder], WEAVE_ARGS[:file])
```

0.3 Appendix

These benchmarks are a part of the SciMLBenchmarks.jl repository, found at: <https://github.com/SciML/SciMLBenchmarks.jl>. For more information on high-performance scientific machine learning, check out the SciML Open Source Software Organization <https://sciml.ai>.

To locally run this benchmark, do the following commands:

```
using SciMLBenchmarks  
SciMLBenchmarks.weave_file("StiffODE", "Pollution.jmd")
```

Computer Information:

Julia Version 1.4.2

Commit 44fa15b150* (2020-05-23 18:35 UTC)

Platform Info:

OS: Linux (x86_64-pc-linux-gnu)

CPU: Intel(R) Core(TM) i7-9700K CPU @ 3.60GHz

WORD_SIZE: 64

LIBM: libopenlibm

LLVM: libLLVM-8.0.1 (ORCJIT, skylake)

Environment:

JULIA_LOAD_PATH = /builds/JuliaGPU/DiffEqBenchmarks.jl:

JULIA_DEPOT_PATH = /builds/JuliaGPU/DiffEqBenchmarks.jl/.julia

JULIA_CUDA_MEMORY_LIMIT = 2147483648

JULIA_NUM_THREADS = 8

Package Information:

Status: `~/builds/JuliaGPU/DiffEqBenchmarks.jl/benchmarks/StiffODE/Project.toml`

[eb300fae-53e8-50a0-950c-e21f52c2b7e0] DiffEqBiological 4.3.0

[f3b72e0c-5b89-59e1-b016-84e28bfd966d] DiffEqDevTools 2.24.0

[5a33fad7-5ce4-5983-9f5d-5f26ceab5c96] GeometricIntegratorsDiffEq 0.1.0

[7f56f5a3-f504-529b-bc02-0b1fe5e64312] LSODA 0.6.1

[c030b06c-0b6d-57c2-b091-7029874bd033] ODE 2.5.0

[09606e27-ecf5-54fc-bb29-004bd9f985bf] ODEInterfaceDiffEq 3.7.0

[1dea7af3-3e70-54e6-95c3-0bf5283fa5ed] OrdinaryDiffEq 5.41.0

[65888b18-ceab-5e60-b2b9-181511a3b968] ParameterizedFunctions 5.4.0

[91a5bcdd-55d7-5caf-9e0b-520d859cae80] Plots 1.5.5

[b4db0fb7-de2a-5028-82bf-5021f5cfa881] ReactionNetworkImporters 0.1.5

[c3572dad-4567-51f8-b174-8c6c989267f4] Sundials 4.2.5

[a759f4b9-e2f1-59dc-863e-4aeb61b1ea8f] TimerOutputs 0.5.6

[37e2e46d-f89d-539d-b4ee-838fcccc9c8e] LinearAlgebra