

Title: Numerical Methods Lecture

Speakers: Dustin Lang

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Linear Algebra 1.ipynb

Code Julia 1.10.0

Linear Algebra 1

```
[ ]:
```



Linear Algebra 1.ipynb

Markdown

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Vector space

- additive group $(x+y, -x, 0)$
- scalar multiplication

Speed of computers

- Flop/sec (FL0ating Point 0Peration):
- Intel CPU: $2.4 \text{ GHz} * 8 * 2 * 4 * 2 \approx 300 \text{ GFlop/sec}$

[]:

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Linear Algebra 1.ipynb Julia 1.10.0

Vector space

- additive group $(x+y, -x, 0)$
- scalar multiplication

```
## Speed of computers  
- Flop/sec (FL0ating Point OPeration):  
- Intel CPU: 2.4 GHz * 8 * 2 * 4 * 2 ≈ 300 GFlop/sec (double precision)|  
- AMD GPU: 4000 GFlop/sec (single precision)
```

[]:

Simple 0 3 Julia 1.10.0 | Idle Mode: Edit Ln 4, Col 72 Linear Algebra 1.ipynb

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- scalar multiplication

Speed of computers

- Flop/sec (FLOating Point OPERATION):
 - Intel CPU: $2.4 \text{ GHz} * 8 * 2 * 4 * 2 \approx 300 \text{ GFlop/sec}$ (double precision)
 - AMD GPU: 4000 GFlop/sec (single precision)
 - Intel GPU: 400 GFlop/sec (single precision)
- Memory bandwidth (Bytes/sec):
 - System: 42 GByte/sec
 - AMD GPU: 192 GByte/sec

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Simple 0 \$ 3 Julia 1.10.0 | Idle Mode: Command Ln 1, Col 1 Linear Algebra 1.ipynb

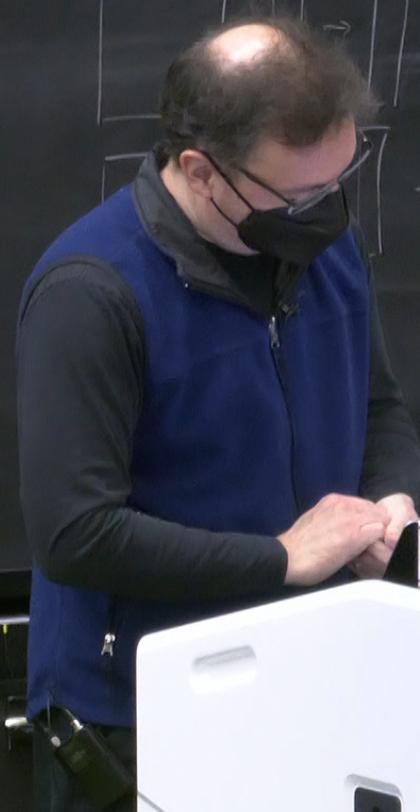
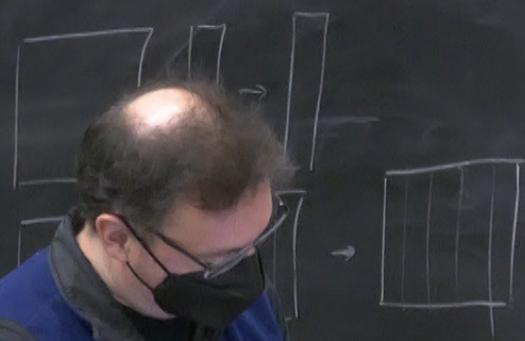
Op	Flop	Memory
$x+y$	$O(n)$	$O(n)$
$x \cdot y$	$O(n)$	$O(n)$
$A \cdot x$	$O(n^2)$	$O(n^2)$
$A \cdot B$	$O(n^3)$	$O(n^2)$

$$n^2 + 2n \in O(n^2)$$



Op	Flop	Memory
$x+y$	$O(n)$	$O(n)$
$x \cdot y$	$O(n)$	$O(n)$
$A \cdot x$	$O(n^2)$	$O(n^2)$
$A \cdot B$	$O(n^3)$	$O(n^2)$
$A \cdot x = b$	$O(n^3)$	$O(n^2)$

$$n^2 + 2n \in O(n^2)$$



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$O(f(n)) := \{g(n): \text{there exist } C, n_0 \text{ such that } g(n) \leq C f(n) \text{ for all } n \geq n_0\}$

Measuring Performance

```
[4]: using BenchmarkTools
```

```
[6]: A = randn(2000, 2000);
      B = randn(2000, 2000);
```

```
[7]: @benchmark A * B
```

```
[7]: BenchmarkTools.Trial: 60 samples with 1 evaluation.
      Range (min ... max): 61.598 ms ... 144.326 ms | GC (min ... max): 0.00% ... 0.32%
      Time (median): 91.265 ms | GC (median): 0.00%
      Time (mean ± σ): 83.502 ms ± 19.830 ms | GC (mean ± σ): 4.89% ± 10.96%
```

61.6 ms Histogram: frequency by time 113 ms <

Memory estimate: 30.52 MiB, allocs estimate: 2.

```
[ ]: 2|
```

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```
[4]: using BenchmarkTools
```

```
[6]: A = randn(2000, 2000);
      B = randn(2000, 2000);
```

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[7]: @benchmark A * B
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[7]: BenchmarkTools.Trial: 60 samples with 1 evaluation.
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      Time (mean ± σ): 83.502 ms ± 19.830 ms | GC (mean ± σ): 4.89% ± 10.96%
```

61.6 ms Histogram: frequency by time 113 ms <

```
Memory estimate: 30.52 MiB, allocs estimate: 2.
```

```
[8]: (2 * 2000^3) / (300.0e9)
```

```
[8]: 0.053333333333333334
```

```
[ ]:
```

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Linear Algebra 1.ipynb

Code

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memory estimate: 30.52 MiB, allocs estimate: 2.

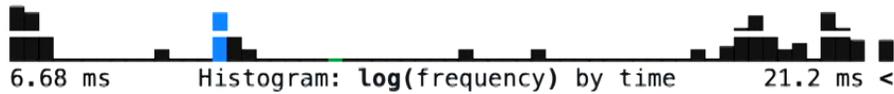
[8]: $(2 * 2000^3) / (300.0e9)$

[8]: 0.05333333333333334

[9]: @benchmark A + B

[9]: BenchmarkTools.Trial: 416 samples with 1 evaluation.

Range (min ... max):	6.681 ms ... 33.749 ms	GC (min ... max):	0.00% ... 2.86%
Time (median):	10.158 ms	GC (median):	0.00%
Time (mean ± σ):	12.021 ms ± 6.111 ms	GC (mean ± σ):	4.95% ± 11.96%



Memory estimate: 30.52 MiB, allocs estimate: 2.

[10]: $(2000^2) / (300.0e9)$

[10]: 1.3333333333333333e-5

[]:



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Code

Julia 1.10.0

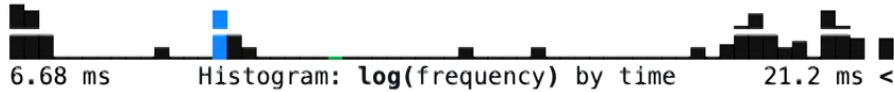
[8]: $(2 * 2000^3) / (300.0e9)$

[8]: 0.05333333333333334

[9]: @benchmark A + B

[9]: BenchmarkTools.Trial: 416 samples with 1 evaluation.

Range (min ... max):	6.681 ms ... 33.749 ms	GC (min ... max):	0.00% ... 2.86%
Time (median):	10.158 ms	GC (median):	0.00%
Time (mean ± σ):	12.021 ms ± 6.111 ms	GC (mean ± σ):	4.95% ± 11.96%



Memory estimate: 30.52 MiB, allocs estimate: 2.

[10]: $(2000^2) / (300.0e9)$

[10]: 1.3333333333333333e-5

[]:

Linear Algebra 1.ipynb

Code

Julia 1.10.0

6.68 ms Histogram: **log(frequency)** by time 21.2 ms <

Memory estimate: 30.52 MiB, allocs estimate: 2.

[10]: $(2000^2) / (300.0e9)$

[10]: 1.3333333333333333e-5

[11]: $(3 * 2000^2) / (5.0e9)$

[11]: 0.0024

[12]: *## Linear Algebra algorithms in Julia*

[13]: **using** LinearAlgebra

[15]: `zeros(3)`

[15]: 3-element Vector{Float64}:
0.0
0.0
0.0

[]: zero



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Code

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0.0 0.0 0.0

[17]: randn(3)

[17]: 3-element Vector{Float64}:
-0.03961828888714106
1.1513891553196174
0.553335533719225

[18]: randn(3, 3)

[18]: 3x3 Matrix{Float64}:
-0.185081 -1.04811 0.38918
0.0807733 0.355 -0.00181466
-0.378778 0.0441798 0.196775

[19]: rand(3)

[19]: 3-element Vector{Float64}:
0.33970282104080896
0.6519037095368856
0.7530764198531269

[]: I

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Linear Algebra 1.ipynb Julia 1.10.0

```
[22]: size(x)
[22]: (3,)
[23]: typeof(A)
[23]: Matrix{Float64} (alias for Array{Float64, 2})
[24]: typeof(x)
[24]: Vector{Float64} (alias for Array{Float64, 1})
[25]: A'
```

3x3 adjoint(::Matrix{Float64}) with eltype Float64:

1.3348	-1.10346	-0.390774
0.680247	-0.446663	0.314232
0.667256	2.2645	-2.39061

[]:

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Code Julia 1.10.0

```
[25]: A'
```

```
[25]: 3x3 adjoint(::Matrix{Float64}) with eltype Float64:  
1.3348 -1.10346 -0.390774  
0.680247 -0.446663 0.314232  
0.667256 2.2645 -2.39061
```

```
[26]: typeof(A')
```

```
[26]: Adjoint{Float64, Matrix{Float64}}
```

```
[27]: Symmetric(A)
```

```
[27]: 3x3 Symmetric{Float64, Matrix{Float64}}:  
1.3348 0.680247 0.667256  
0.680247 -0.446663 2.2645  
0.667256 2.2645 -2.39061
```

```
[ ]:
```

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Linear Algebra 1.ipynb Julia 1.10.0

```
1.3348 0.680247 0.667256
0.680247 -0.446663 2.2645
0.667256 2.2645 -2.39061
```

[28]: `A \ x`

```
3-element Vector{Float64}:
 1.000694140455933
-1.200512562021521
-0.045725878513921694
```

[29]: `det(A)`

```
-2.2687653844316045
```

[30]: `inv(A)`

```
3x3 Matrix{Float64}:
-0.157011 -0.809198 -0.810333
 1.55277  1.29156  1.65682
 0.229767 0.30204 -0.0680652
```

[]:

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Linear Algebra 1.ipynb Julia 1.10.0

```
1.3348 0.680247 0.667256
0.680247 -0.446663 2.2645
0.667256 2.2645 -2.39061
```

[28]: `A \ x`

```
3-element Vector{Float64}:
 1.000694140455933
-1.200512562021521
-0.045725878513921694
```

[29]: `det(A)`

```
-2.2687653844316045
```

[30]: `inv(A)`

```
3x3 Matrix{Float64}:
-0.157011 -0.809198 -0.810333
 1.55277  1.29156  1.65682
 0.229767 0.30204 -0.0680652
```

[31]: *# want to solve $A*x=b$*

[]:

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Linear Algebra 1.ipynb Julia 1.10.0

```
[30]: 3×3 Matrix{Float64}:  
      -0.157011 -0.809198 -0.810333  
      1.55277  1.29156  1.65682  
      0.229767 0.30204  -0.0680652
```

```
[33]: b = randn(3)
```

```
[33]: 3-element Vector{Float64}:  
      -1.3411340752680885  
      0.7254748435083499  
      -1.1400520354843053
```

```
[32]: # want to solve  $A*x=b$   
      inv(A)*b
```

```
UndefVarError: `b` not defined
```

```
Stacktrace:  
 [1] top-level scope  
      @ In[32]:2
```

```
[ ]:
```

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Code Julia 1.10.0

```
[30]: 3×3 Matrix{Float64}:  
      -0.157011 -0.809198 -0.810333  
      1.55277  1.29156  1.65682  
      0.229767 0.30204  -0.0680652
```

```
[33]: b = randn(3)
```

```
[33]: 3-element Vector{Float64}:  
      -1.3411340752680885  
      0.7254748435083499  
      -1.1400520354843053
```

```
[35]: # want to solve A*x=b  
      inv(A)*b # don't do this!
```

```
[35]: 3-element Vector{Float64}:  
      0.5473414416336605  
      -3.0343371750946657  
      -0.011428138085938164
```

```
[ ]:
```

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Linear Algebra 1.ipynb Julia 1.10.0

```
[35]: 3-element Vector{Float64}:  
      0.5473414416336605  
      -3.0343371750946657  
      -0.011428138085938164  
  
[36]: eigen(A)  
  
[36]: Eigen{ComplexF64, ComplexF64, Matrix{ComplexF64}, Vector{ComplexF64}}  
      values:  
      3-element Vector{ComplexF64}:  
      -2.706305454548882 + 0.0im  
      0.6019125563293239 - 0.6899470728876264im  
      0.6019125563293239 + 0.6899470728876264im  
      vectors:  
      3×3 Matrix{ComplexF64}:  
      0.00233615+0.0im  0.438962-0.434723im  0.438962+0.434723im  
      -0.707294+0.0im  -0.7727-0.0im      -0.7727+0.0im  
      0.706916+0.0im  -0.143898+0.0235909im -0.143898-0.0235909im  
  
[ ]: |
```

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Linear Algebra 1.ipynb Julia 1.10.0

```
3-element Vector{Float64}:
-6.088395579498553
 0.364145738970711
 2.719289156748023
vectors:
3×3 Matrix{Float64}:
-0.0498068  0.108737  0.992822
-0.447318  0.886353  -0.119516
 0.892987  0.45006   -0.00449347

[38]: svd(A)

[38]: SVD{Float64, Float64, Matrix{Float64}, Vector{Float64}}
U factor:
3×3 Matrix{Float64}:
 0.128355 -0.83366  0.537156
 0.707356  0.456593  0.539602
-0.695106  0.3107   0.6483
singular values:
3-element Vector{Float64}:
 3.3957094569244264
 1.882665774010618
 0.3548835229735769
Vt factor:
3×3 Matrix{Float64}:
-0.0994149 -0.131655  0.986298
-0.923166  -0.357687 -0.140797
```

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```
[-0.447318  0.886353 -0.119516
 0.892987   0.45006  -0.00449347]

[38]: svd(A)

[38]: SVD{Float64, Float64, Matrix{Float64}, Vector{Float64}}
U factor:
3x3 Matrix{Float64}:
 0.128355 -0.83366  0.537156
 0.707356  0.456593  0.539602
-0.695106  0.3107   0.6483
singular values:
3-element Vector{Float64}:
 3.3957094569244264
 1.882665774010618
 0.3548835229735769
Vt factor:
3x3 Matrix{Float64}:
-0.0994149 -0.131655  0.986298
-0.923166  -0.357687 -0.140797
-0.371323  0.924514  0.0859797

[ ]: |
```

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Linear Algebra 1.ipynb

Code

Julia 1.10.0

```
[38]: SVD{Float64, Float64, Matrix{Float64}, Vector{Float64}}
U factor:
3x3 Matrix{Float64}:
 0.128355 -0.83366  0.537156
 0.707356  0.456593 0.539602
-0.695106  0.3107  0.6483
singular values:
3-element Vector{Float64}:
 3.3957094569244264
 1.882665774010618
 0.3548835229735769
Vt factor:
3x3 Matrix{Float64}:
-0.0994149 -0.131655  0.986298
-0.923166 -0.357687 -0.140797
-0.371323  0.924514  0.0859797
```

```
[39]: using Arpack
```

```
ArgumentError: Package Arpack not found in current path.
- Run `import Pkg; Pkg.add("Arpack")` to install the Arpack package.

Stacktrace:
 [1] macro expansion
 @ Base ./loading.jl:1766 [inlined]
 [2] macro expansion
 @ Base ./loading.jl:1767 [inlined]
```

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```

-0.0994149 -0.131655 0.986298
-0.923166 -0.357687 -0.140797
-0.371323 0.924514 0.0859797

```

[43]: `using Arpack`

[41]: `eigs(A)`

UndefVarError: `eigs` not defined

Stacktrace:

- [1] top-level scope @ In[41]:1

[42]: `svds(A)`

UndefVarError: `svds` not defined

Stacktrace:

- [1] top-level scope @ In[42]:1

[]:

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Linear Algebra 1.ipynb Julia 1.10.0

```

-0.0994149 -0.131655 0.986298
-0.923166 -0.357687 -0.140797
-0.371323 0.924514 0.0859797

[43]: using Arpack

[44]: eigs(A)
Warning: Adjusting nev from 6 to 1
@ Arpack ~/.julia/packages/Arpack/FCvNd/src/Arpack.jl:92
[44]: (ComplexF64[-2.7063054545488834 + 0.0im], ComplexF64[0.00233615160070515 + 0.0im; -0.7072936601453214 + 0.0im; 0.7069159926850808 + 0.0im;;], 1, 1, 3, [0.0, 0.0, 0.0])

[*]: svds(A)

[ ]:
```

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