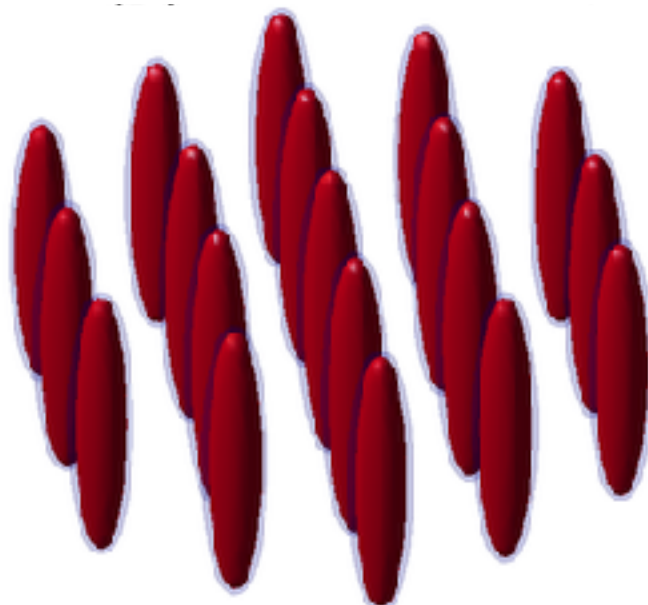


Computing droplet crystals of a magnetic quantum gas

Blair Blakie

Department of Physics, University of Otago, New Zealand

work with **Danny Baillie**



MARSDEN FUND

TE PŪTEA RANGAHAU
A MARSDEN

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of
OTAGO



Te Whare Wānanga o Otāgo

NEW ZEALAND

D. Baillie, R.M. Wilson, R.N. Bisset, & P.B. Blakie, [PRA 94, 021602\(R\) \(2016\)](#).

D. Baillie, R. Wilson, and P.B. Blakie, [PRL 119, 255302 \(2017\)](#)

D. Baillie and P. B. Blakie, [PRL 121, 195301 \(2018\)](#)



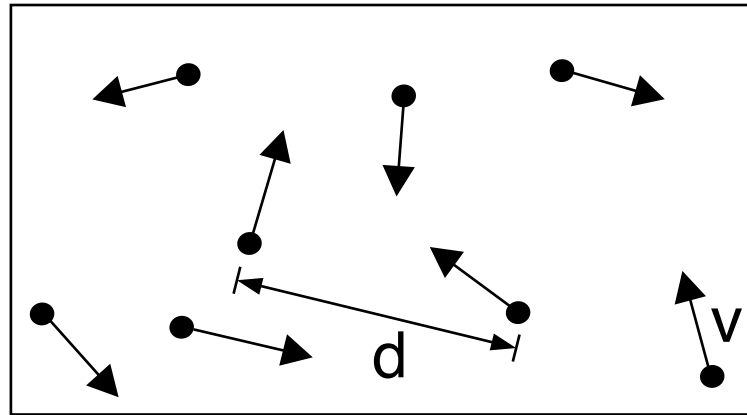
DODD-WALLS CENTRE
FOR PHOTONIC & QUANTUM TECHNOLOGIES

Outline

- Physics: ultra-dilute gases that behave like liquids and solids
- How we do what we do: computational physics

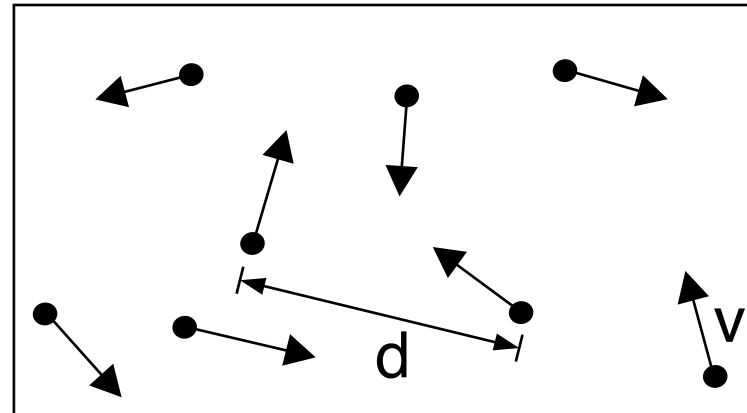
Gas... boring and simple right?

Gas... boring and simple right?



**High
Temperature T:**
thermal velocity v
density d^{-3}
"Billiard balls"

Gas... boring and simple right?

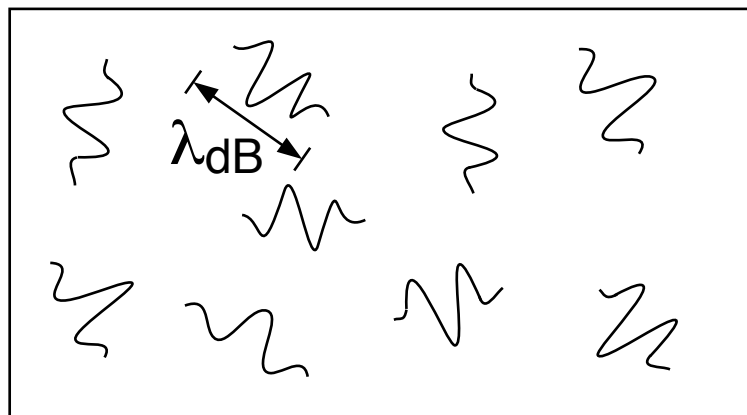


High Temperature T:

thermal velocity v

density d^{-3}

"Billiard balls"



Low

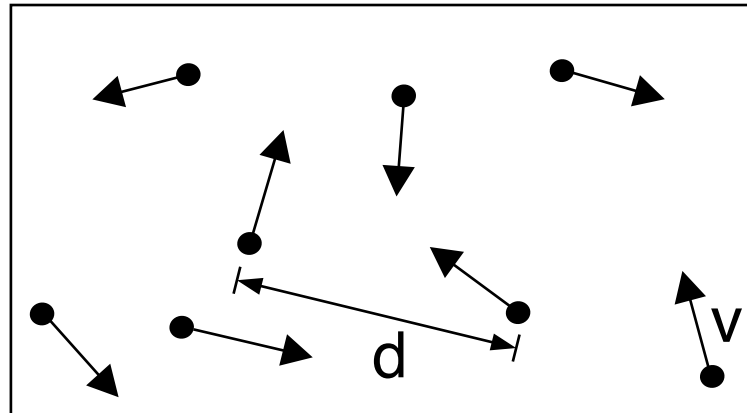
Temperature T:

De Broglie wavelength

$$\lambda_{dB} = h/mv \propto T^{-1/2}$$

"Wave packets"

Gas... boring and simple right?

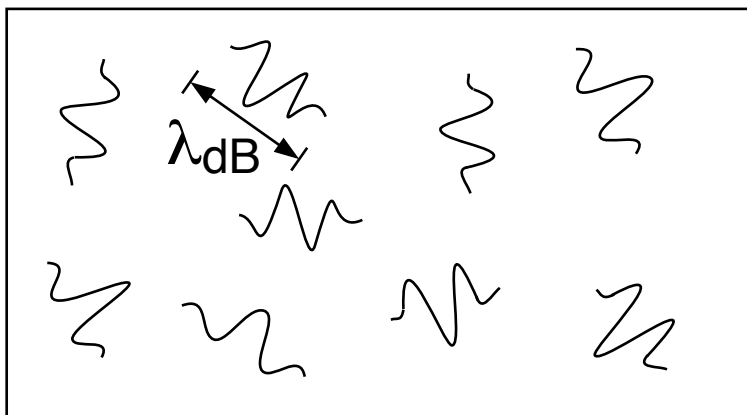


High Temperature T:

thermal velocity v

density d^{-3}

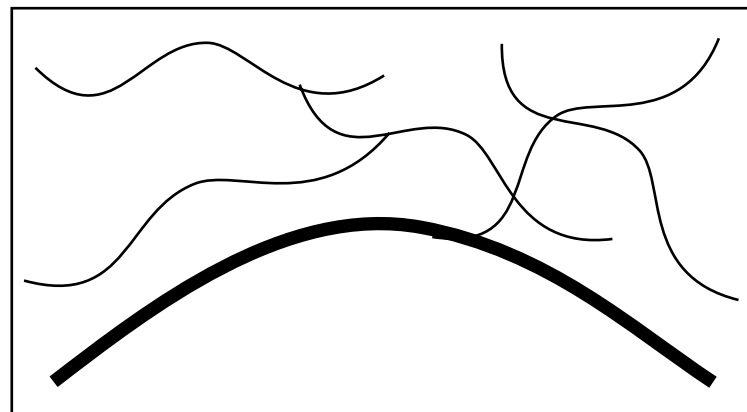
"Billiard balls"



Low Temperature T: De Broglie wavelength

$\lambda_{dB} = h/mv \propto T^{-1/2}$

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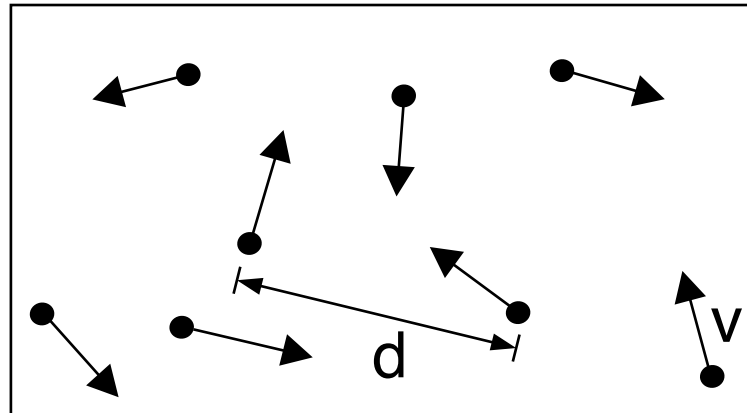


T=T_c: BEC

$\lambda_{dB} \approx d$

"Matter wave overlap"

Gas... boring and simple right?

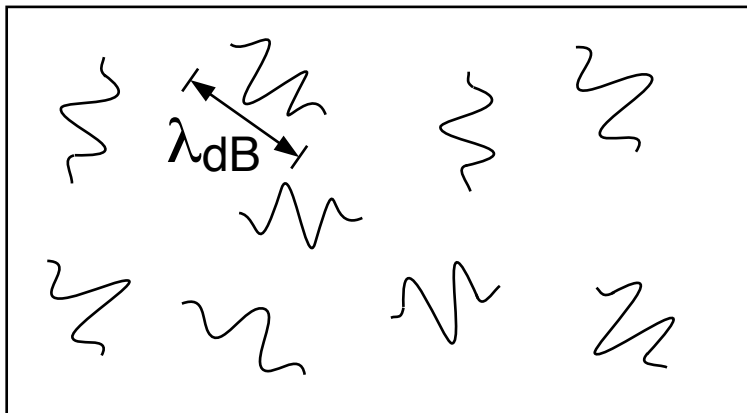


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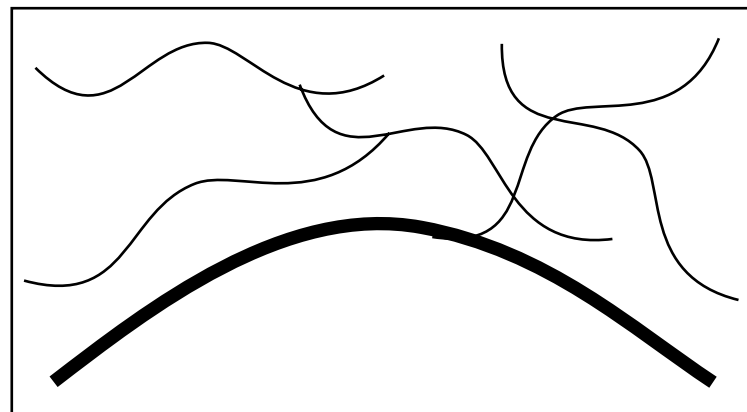
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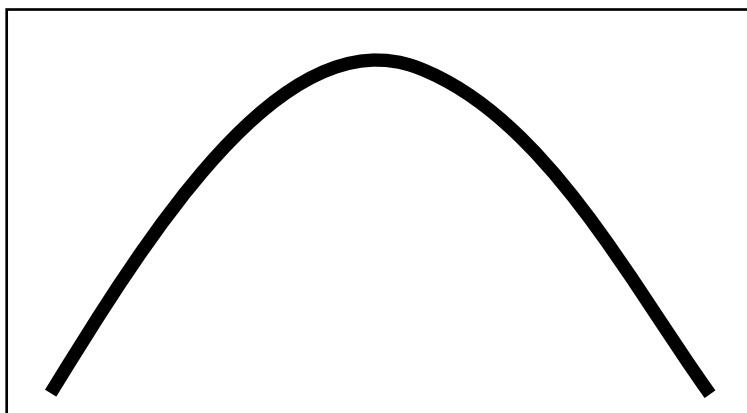


$T = T_c$:

BEC

$\lambda_{dB} \approx d$

"Matter wave overlap"



$T = 0$:

**Pure Bose
condensate**

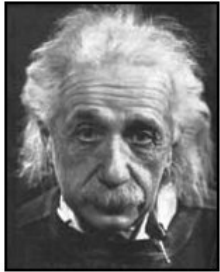
"Giant matter wave"

Bose-Einstein condensation

Bose-Einstein condensation



S.N. Bose
(1894-1974)



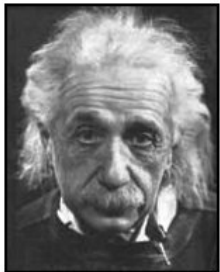
Albert Einstein
(1879-1955)

Predicted 1925

Bose-Einstein condensation



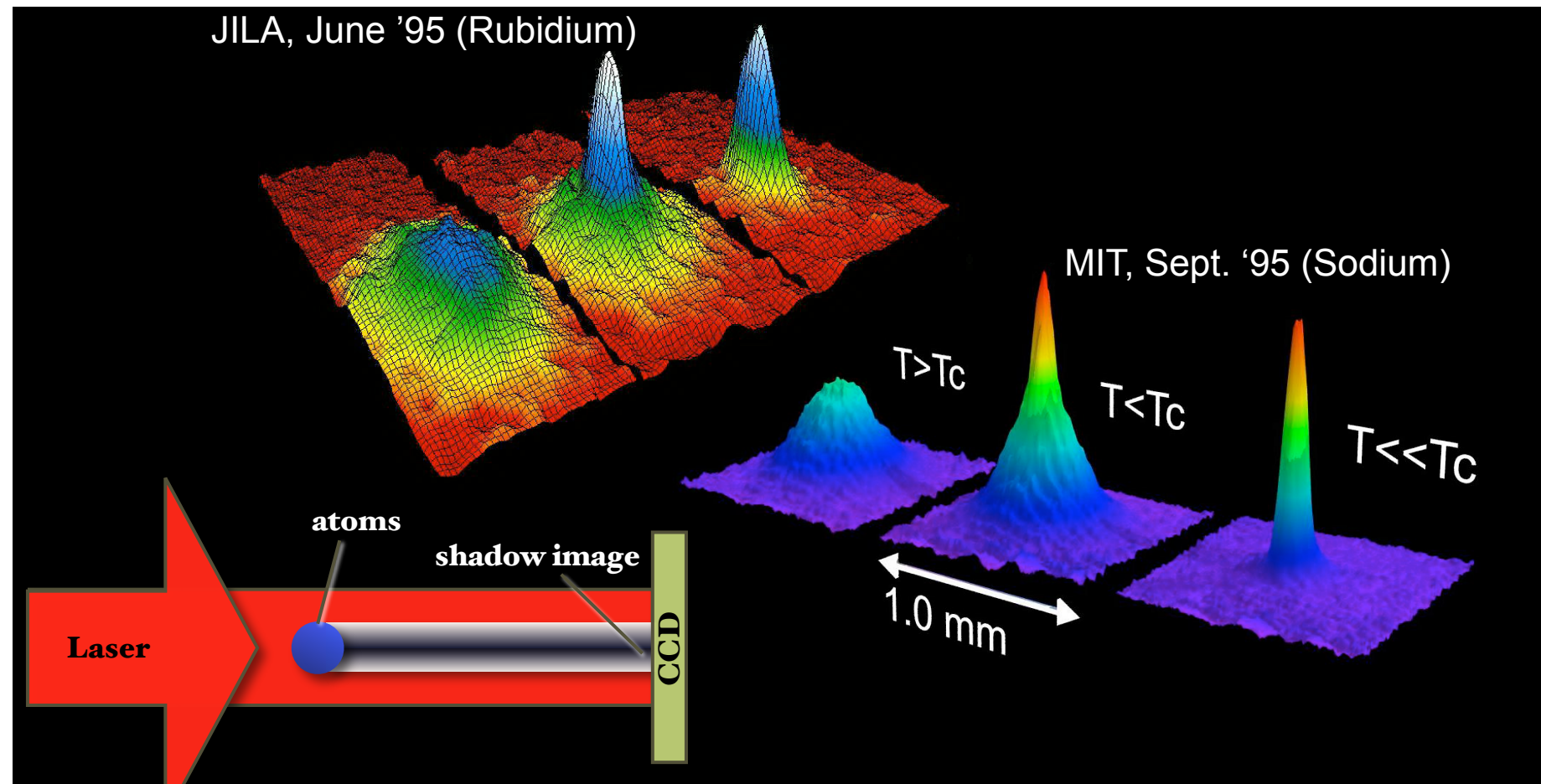
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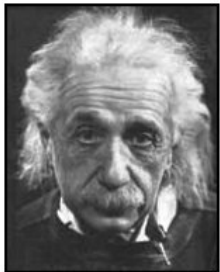
Produced in 1995!



Bose-Einstein condensation



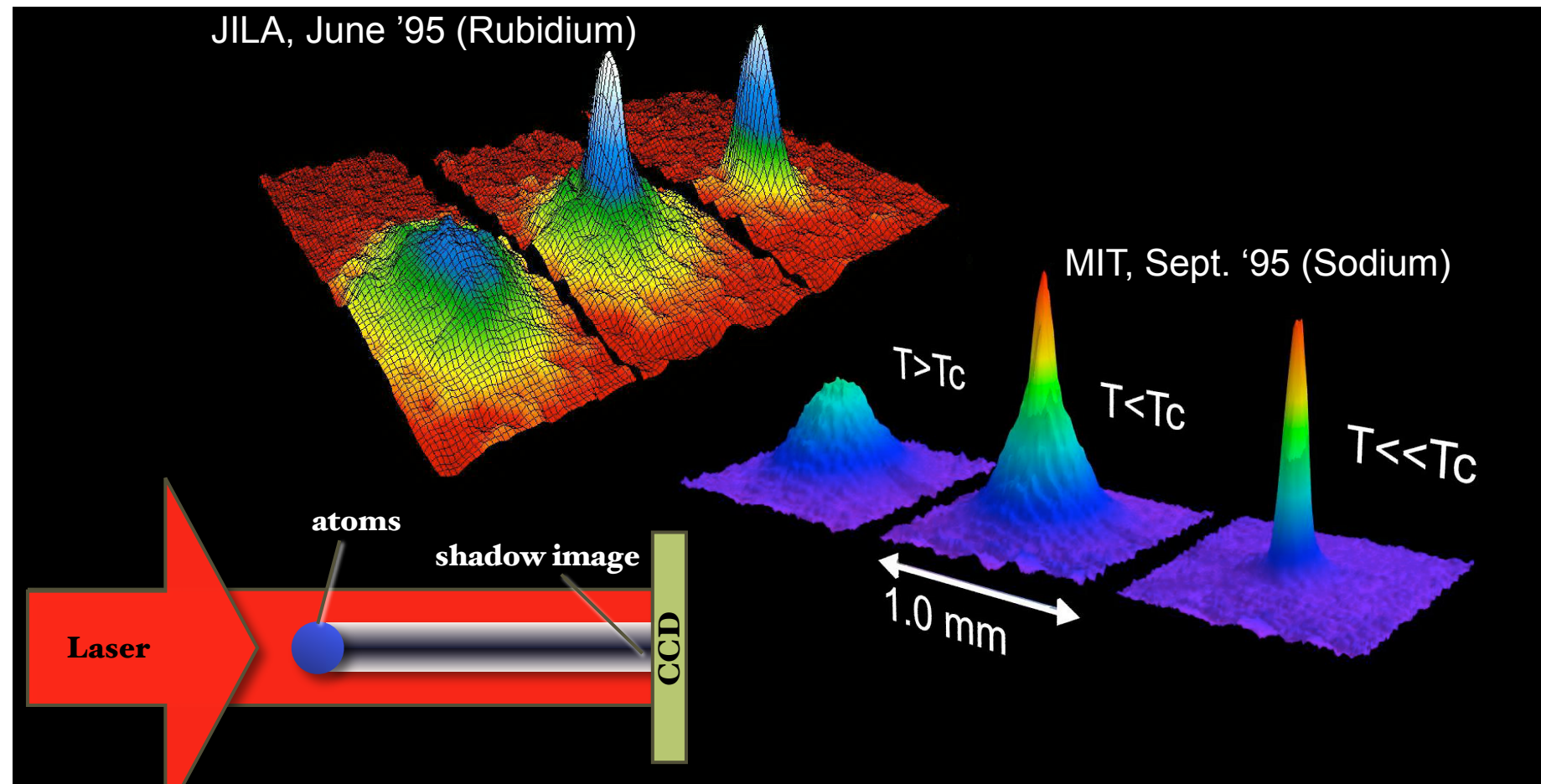
S.N. Bose
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Albert Einstein
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Predicted 1925

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The Nobel Prize in Physics 2001

"for the achievement of Bose-Einstein condensation in dilute gases of alkali atoms, and for early fundamental studies of the properties of the condensates"



E. A. Cornell

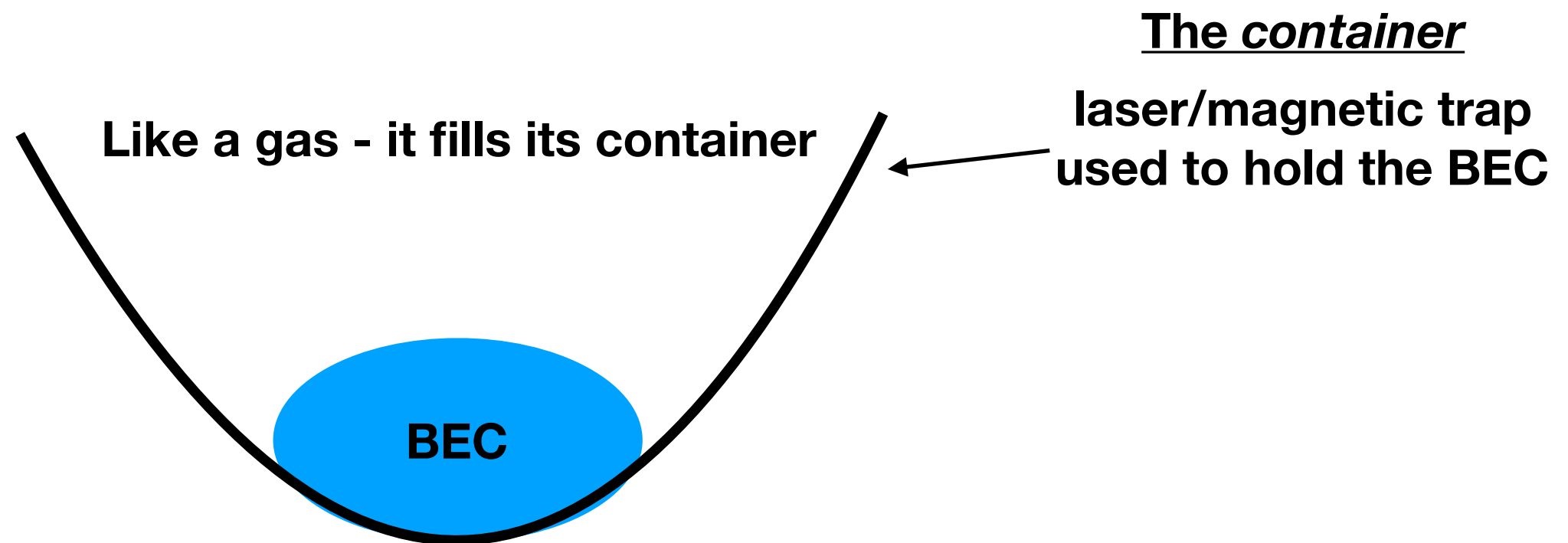


W. Ketterle



C. E. Wieman

But BECs are still gases



It's a Long story...

But thanks to some subtle quantum effects

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But thanks to some subtle quantum effects

$$\frac{E}{V} = \frac{1}{2}g_s n^2 \left[1 + \frac{128}{15\sqrt{\pi}} \sqrt{na_s^3} \right]$$

Lee-Huang-Yang



L



H



Y

T.D. Lee and C.N. Yang, Phys. Rev. **105**, 1119 (1957).

T.D. Lee, K. Huang, and C.N. Yang, Phys. Rev. **106**, 1135 (1957)

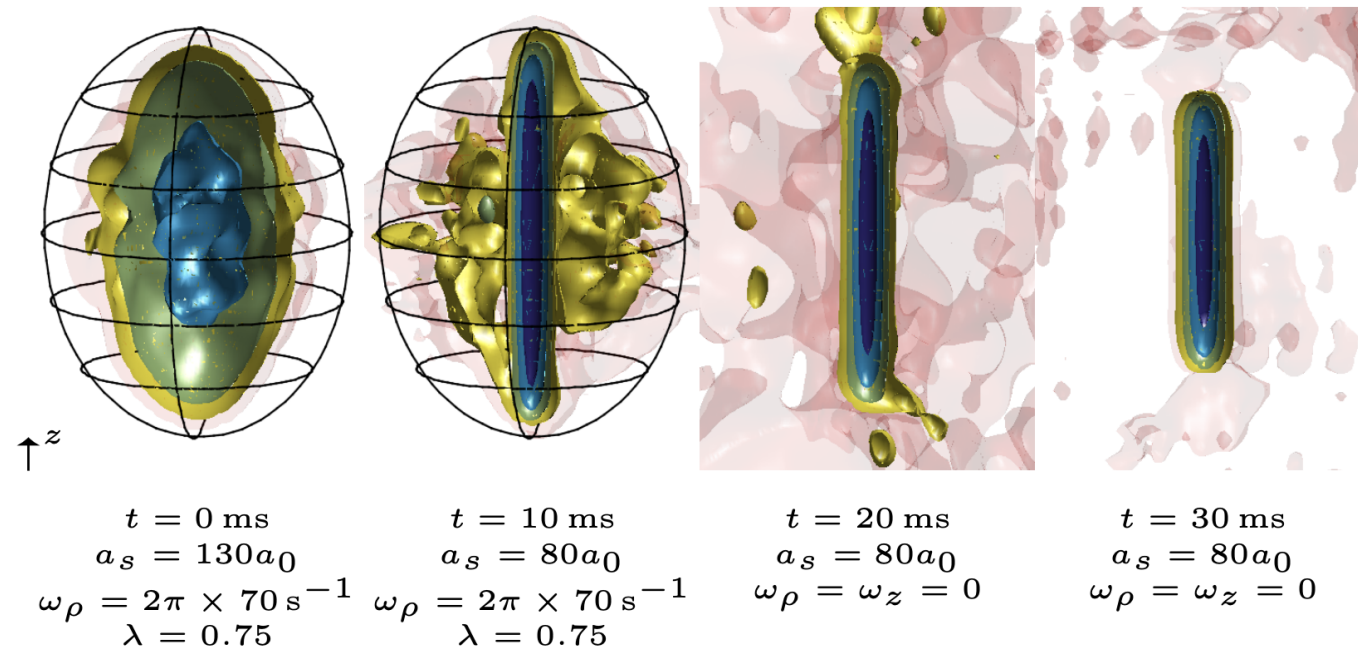
Of highly magnetic atoms

Self-bound droplets

Of highly magnetic atoms

Self-bound droplets

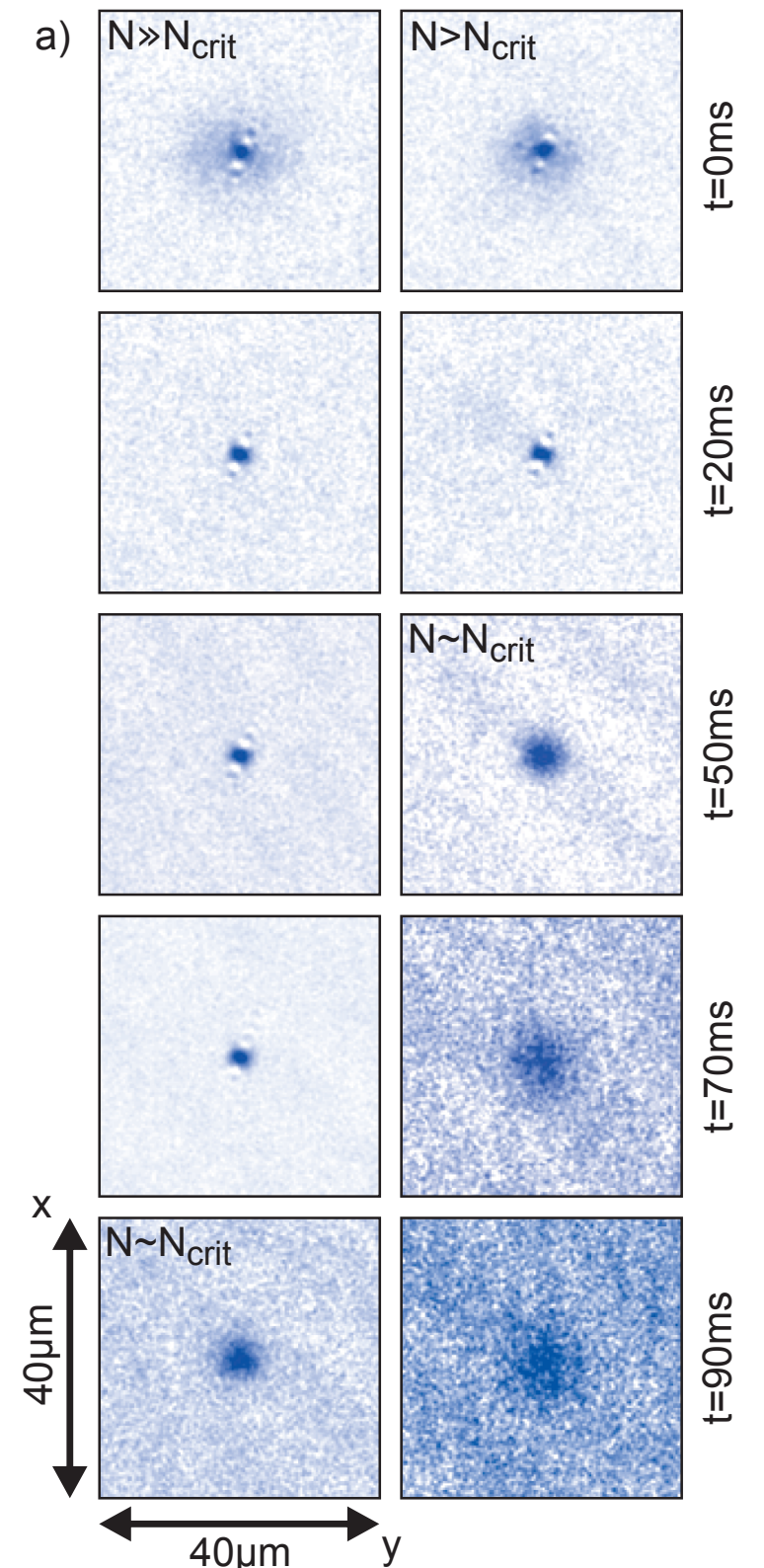
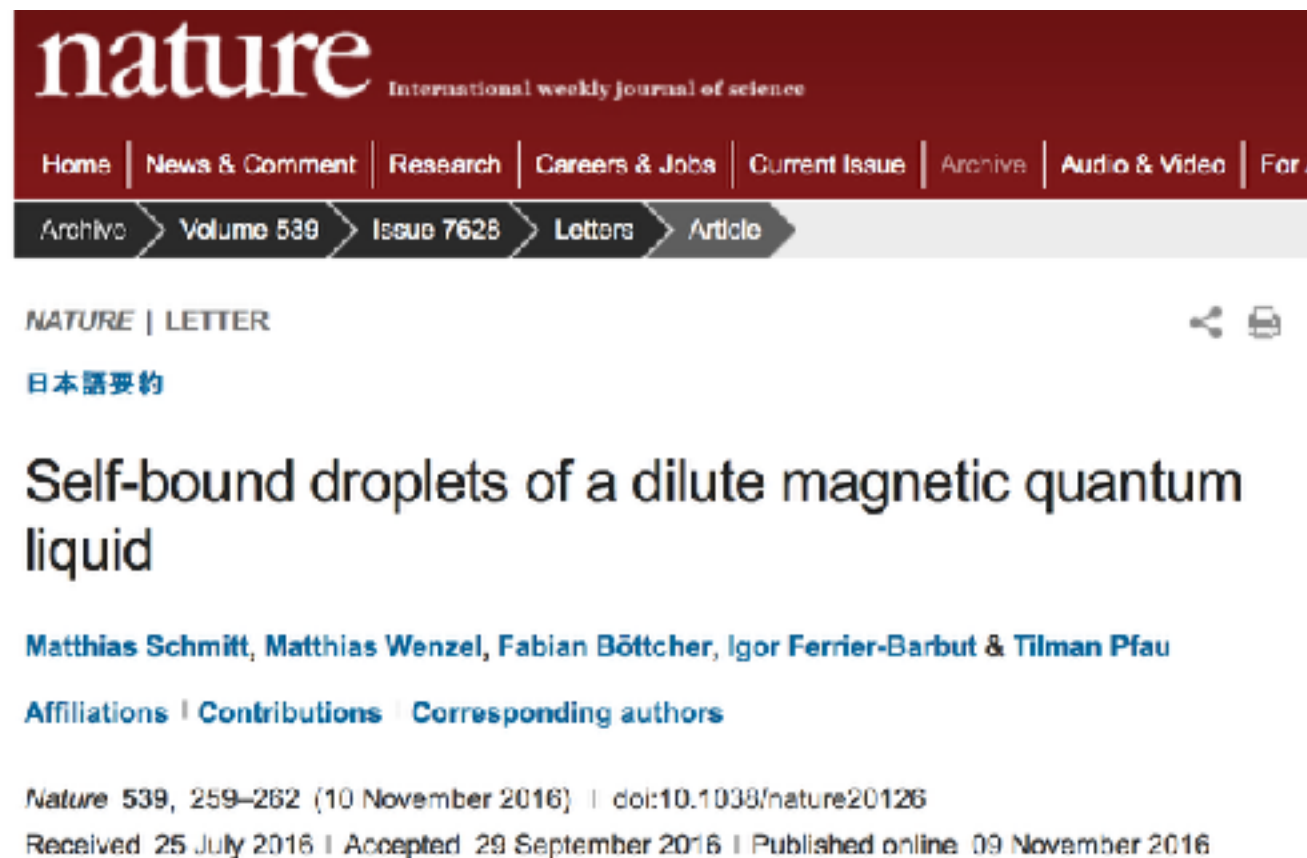
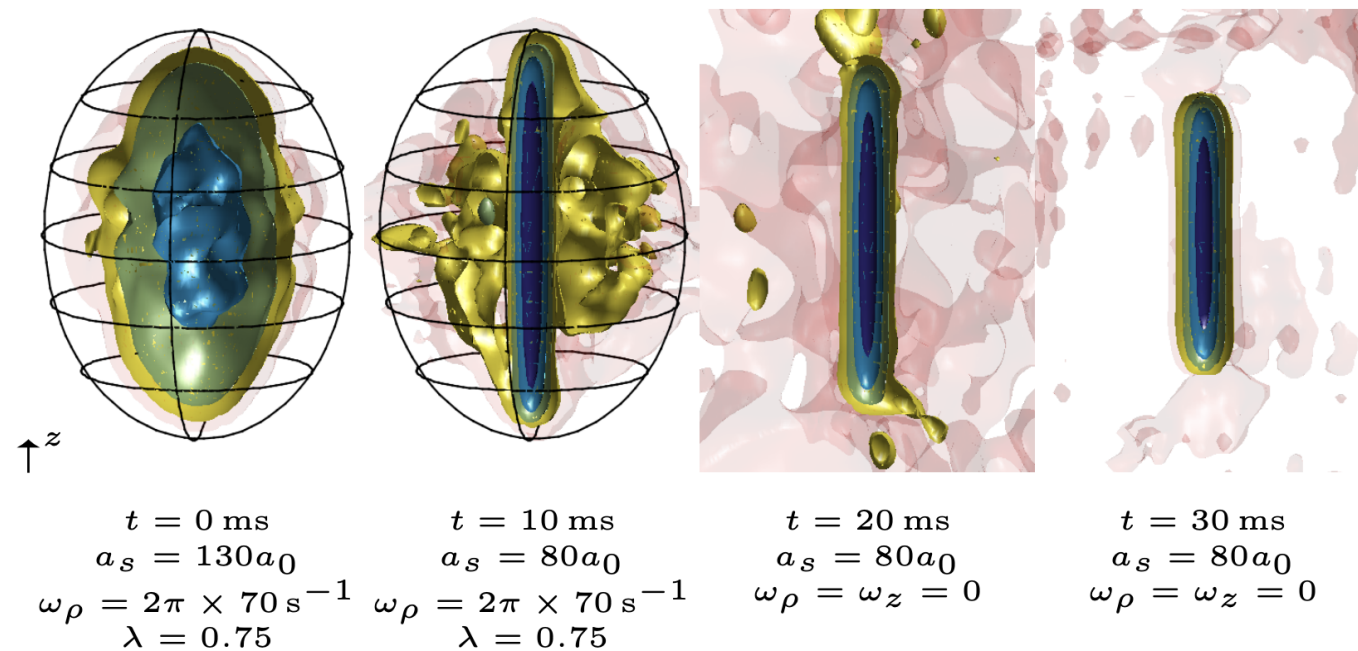
Baillie, Wilson, Bisset and Blakie, PRA(R) (2016)



Self-bound droplets

Of highly magnetic atoms

Baillie, Wilson, Bisset and Blakie, PRA(R) (2016)



One or multiple droplets

- **Droplets behave like a liquid** (e.g. incompressible).
- **Magnetic interactions cause droplets to repel each other**

One or multiple droplets

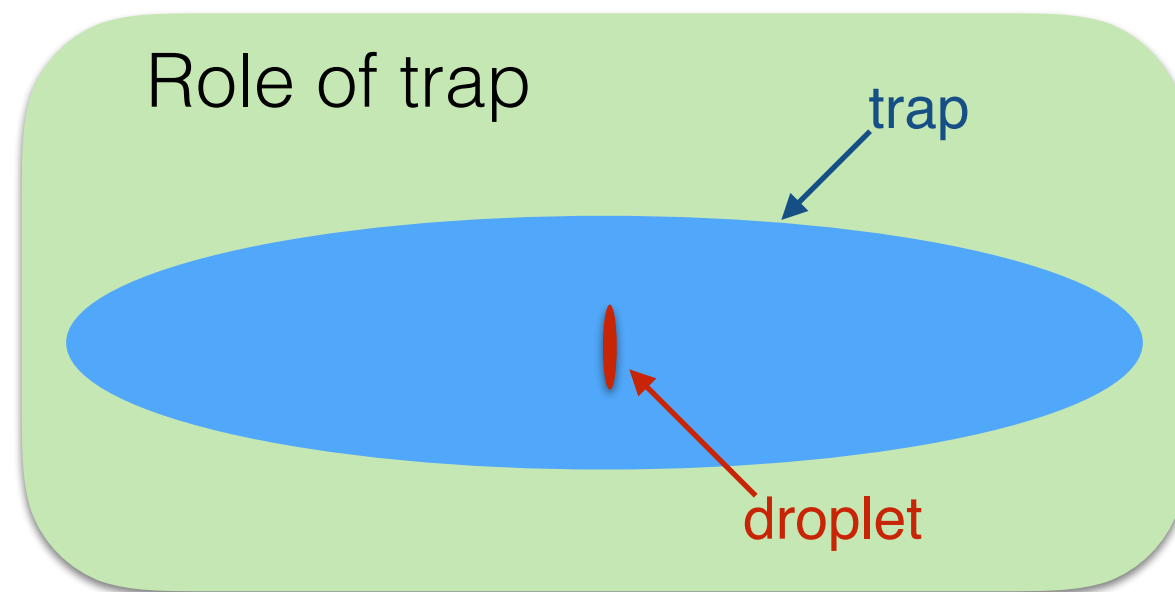
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Adding a trap?

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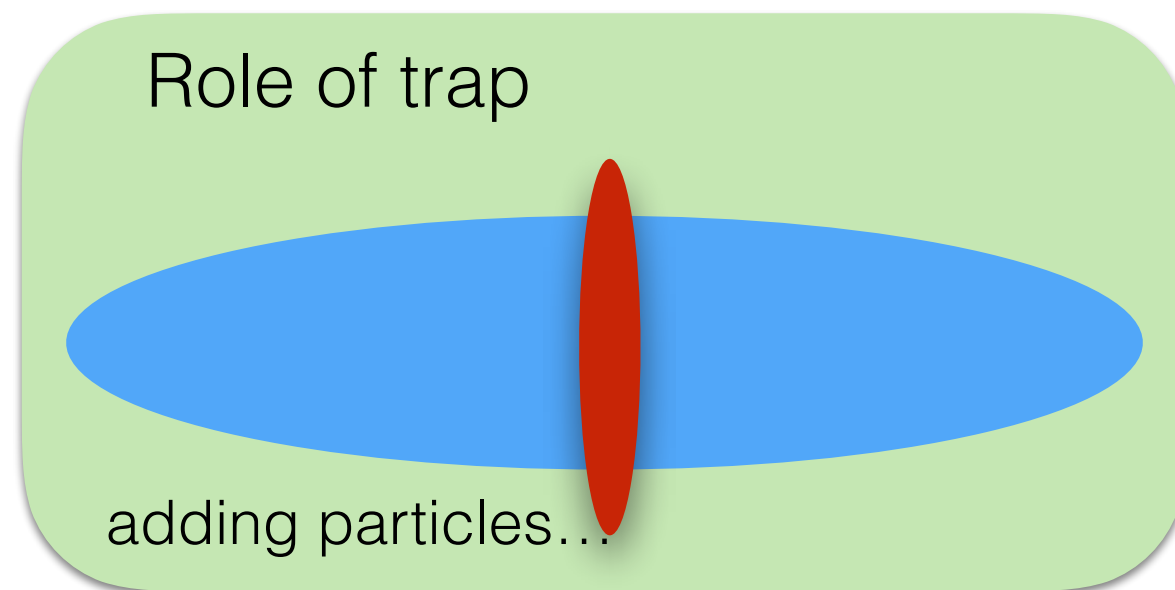
Adding a trap?



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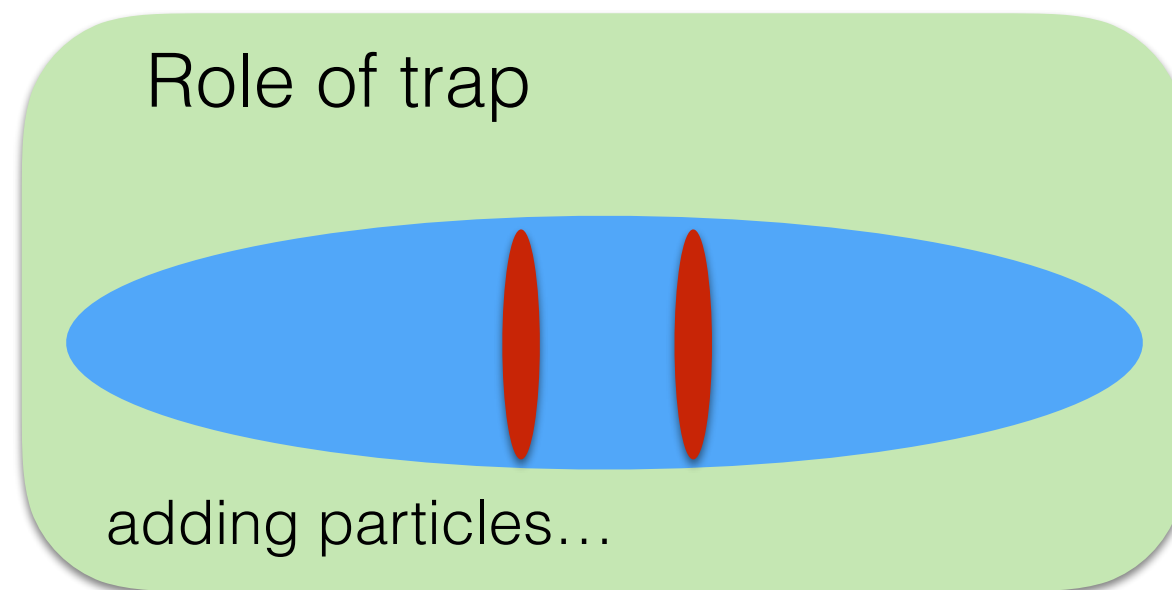
Adding a trap?



One or multiple droplets

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Adding a trap?



Stationary states in a trap

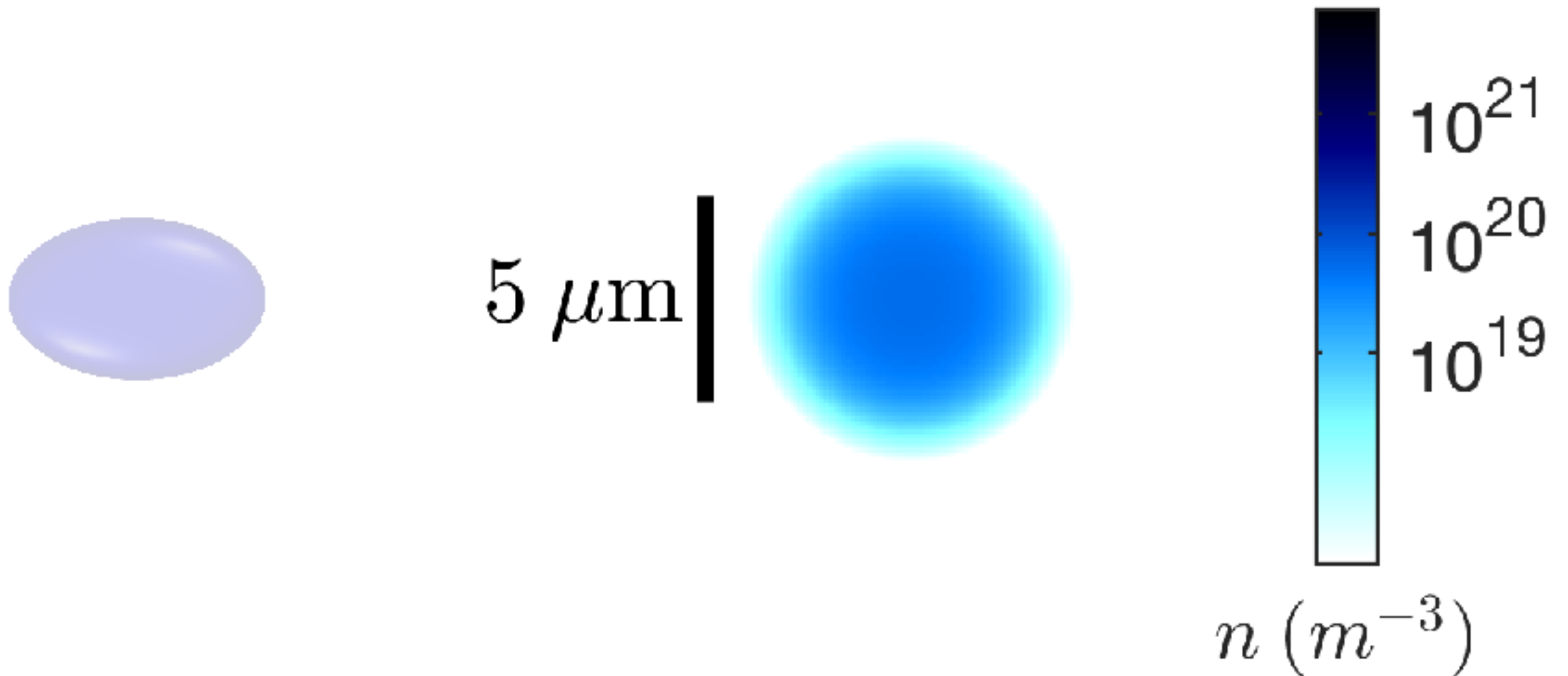
^{164}Dy atoms, $a_s = 70a_0$, $(\omega, \omega_z) = 2\pi \times (60, 300) \text{ Hz}$ varying N

$$i\hbar \frac{\partial \psi}{\partial t} = \left[H_{\text{sp}} + \int d\mathbf{r}' U(\mathbf{r} - \mathbf{r}') |\psi(\mathbf{r}')|^2 + \gamma_{\text{QF}} |\psi|^3 \right] \psi$$

Stationary states in a trap

^{164}Dy atoms, $a_s = 70a_0$, $(\omega, \omega_z) = 2\pi \times (60, 300) \text{ Hz}$ varying N

(a) $\nu = 0$, $N = 1 \times 10^3$



$$i\hbar \frac{\partial \psi}{\partial t} = \left[H_{\text{sp}} + \int d\mathbf{r}' U(\mathbf{r} - \mathbf{r}') |\psi(\mathbf{r}')|^2 + \gamma_{\text{QF}} |\psi|^3 \right] \psi$$

Stationary states in a trap

^{164}Dy atoms, $a_s = 70a_0$, $(\omega, \omega_z) = 2\pi \times (60, 300)$ Hz varying N

(b) $\nu = 1$, $N = 3.98 \times 10^3$



$$i\hbar \frac{\partial \psi}{\partial t} = \left[H_{\text{sp}} + \int d\mathbf{r}' U(\mathbf{r} - \mathbf{r}') |\psi(\mathbf{r}')|^2 + \gamma_{\text{QF}} |\psi|^3 \right] \psi$$

Stationary states in a trap

^{164}Dy atoms, $a_s = 70a_0$, $(\omega, \omega_z) = 2\pi \times (60, 300) \text{ Hz}$ varying N

(c) $\nu = 2$, $N = 10 \times 10^3$



$$i\hbar \frac{\partial \psi}{\partial t} = \left[H_{\text{sp}} + \int d\mathbf{r}' U(\mathbf{r} - \mathbf{r}') |\psi(\mathbf{r}')|^2 + \gamma_{\text{QF}} |\psi|^3 \right] \psi$$

Stationary states in a trap

^{164}Dy atoms, $a_s = 70a_0$, $(\omega, \omega_z) = 2\pi \times (60, 300)$ Hz varying N

(d) $\nu = 3$, $N = 15.8 \times 10^3$



$$i\hbar \frac{\partial \psi}{\partial t} = \left[H_{\text{sp}} + \int d\mathbf{r}' U(\mathbf{r} - \mathbf{r}') |\psi(\mathbf{r}')|^2 + \gamma_{\text{QF}} |\psi|^3 \right] \psi$$

Stationary states in a trap

^{164}Dy atoms, $a_s = 70a_0$, $(\omega, \omega_z) = 2\pi \times (60, 300)$ Hz varying N

(e) $\nu = 4$, $N = 22.4 \times 10^3$



$$i\hbar \frac{\partial \psi}{\partial t} = \left[H_{\text{sp}} + \int d\mathbf{r}' U(\mathbf{r} - \mathbf{r}') |\psi(\mathbf{r}')|^2 + \gamma_{\text{QF}} |\psi|^3 \right] \psi$$

Stationary states in a trap

^{164}Dy atoms, $a_s = 70a_0$, $(\omega, \omega_z) = 2\pi \times (60, 300)$ Hz varying N

(f) $\nu = 5$, $N = 30.2 \times 10^3$



$$i\hbar \frac{\partial \psi}{\partial t} = \left[H_{\text{sp}} + \int d\mathbf{r}' U(\mathbf{r} - \mathbf{r}') |\psi(\mathbf{r}')|^2 + \gamma_{\text{QF}} |\psi|^3 \right] \psi$$

Stationary states in a trap

^{164}Dy atoms, $a_s = 70a_0$, $(\omega, \omega_z) = 2\pi \times (60, 300) \text{ Hz}$ varying N

(g) $\nu = 6$, $N = 35.5 \times 10^3$

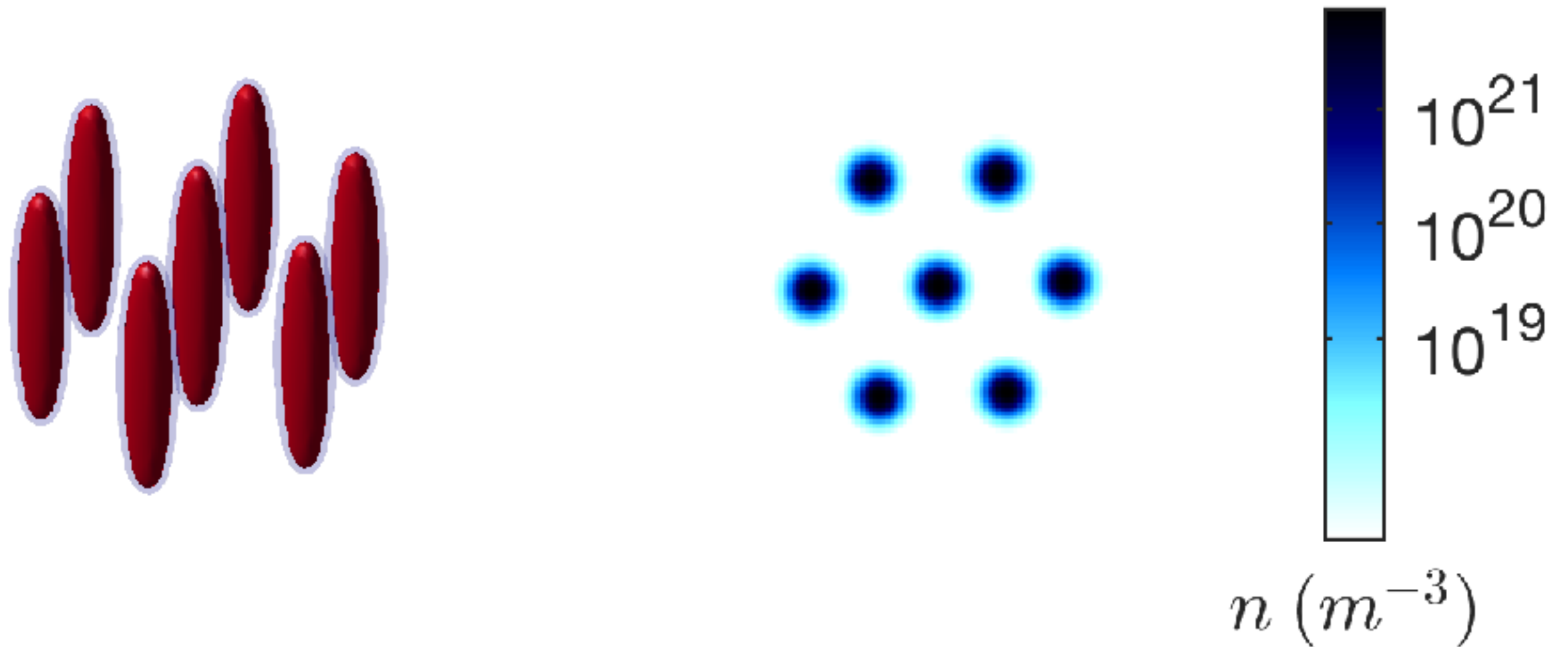


$$i\hbar \frac{\partial \psi}{\partial t} = \left[H_{\text{sp}} + \int d\mathbf{r}' U(\mathbf{r} - \mathbf{r}') |\psi(\mathbf{r}')|^2 + \gamma_{\text{QF}} |\psi|^3 \right] \psi$$

Stationary states in a trap

^{164}Dy atoms, $a_s = 70a_0$, $(\omega, \omega_z) = 2\pi \times (60, 300) \text{ Hz}$ varying N

(h) $\nu = 7$, $N = 39.8 \times 10^3$

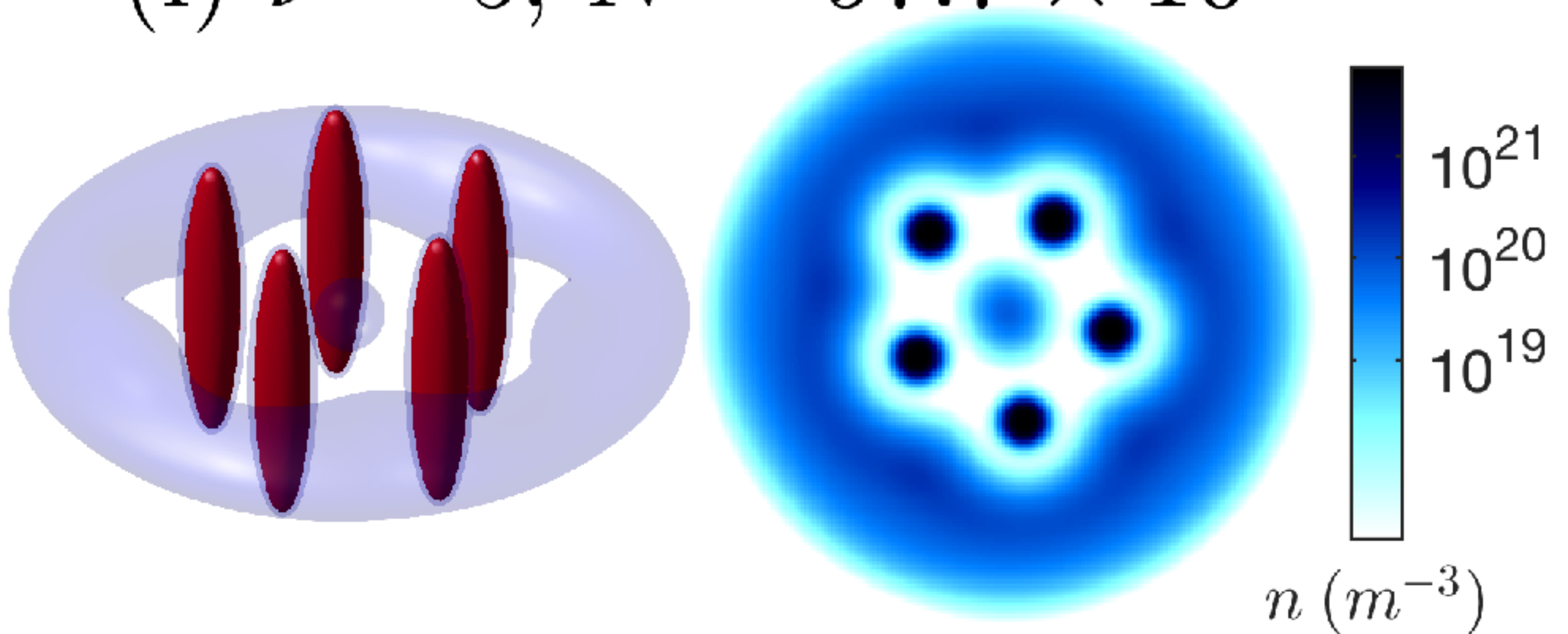


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Stationary states in a trap

^{164}Dy atoms, $a_s = 70a_0$, $(\omega, \omega_z) = 2\pi \times (60, 300) \text{ Hz}$ varying N

(i) $\nu = 5$, $N = 97.7 \times 10^3$

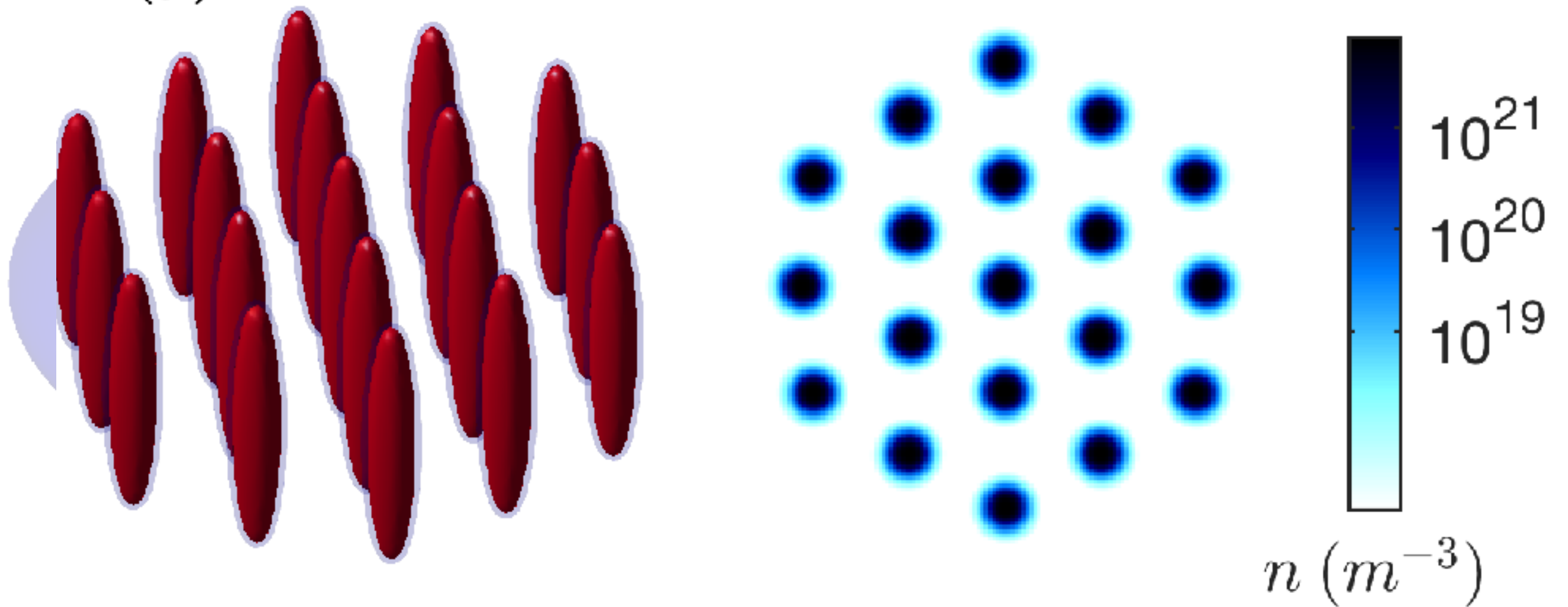


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Stationary states in a trap

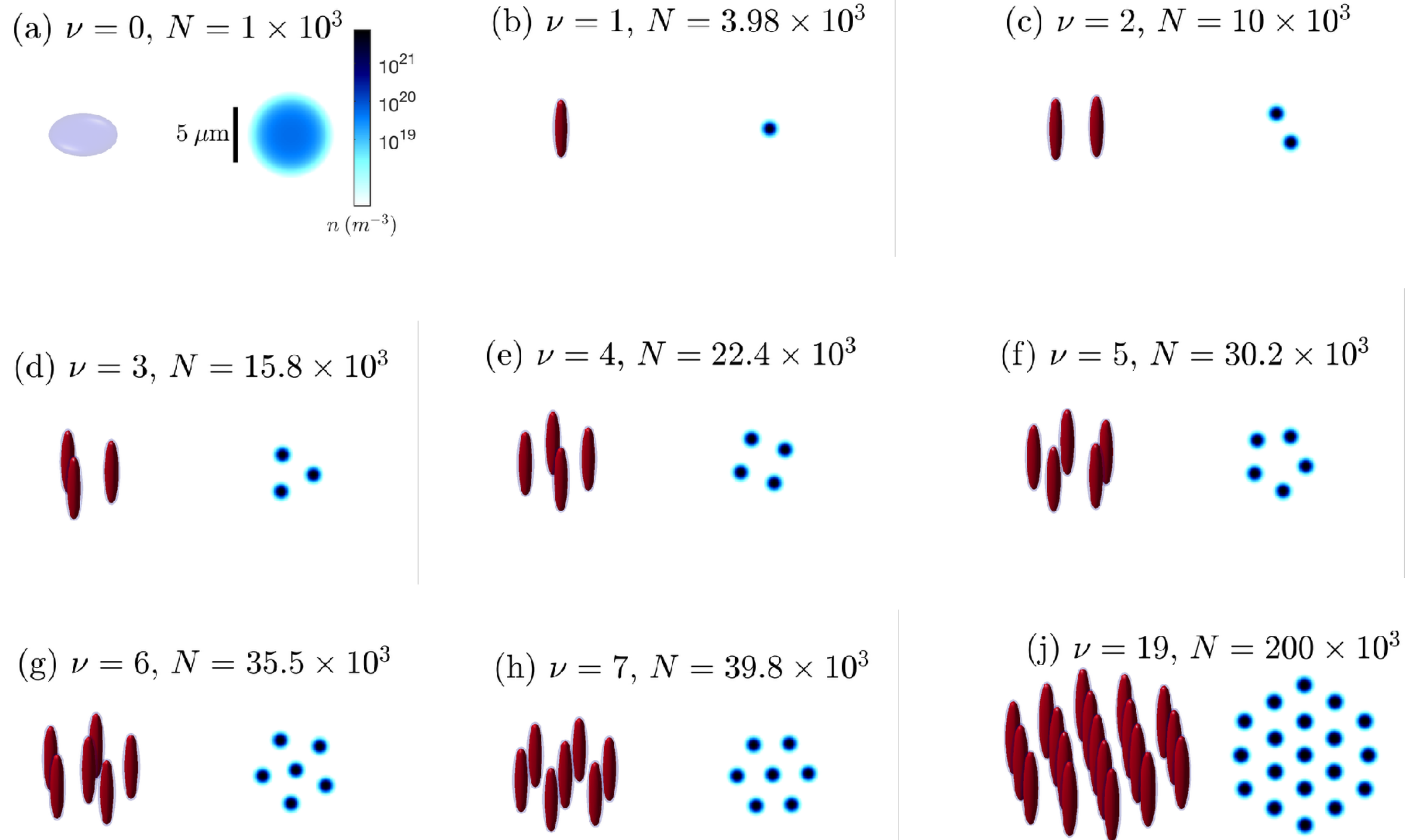
^{164}Dy atoms, $a_s = 70a_0$, $(\omega, \omega_z) = 2\pi \times (60, 300)$ Hz varying N

(j) $\nu = 19$, $N = 200 \times 10^3$



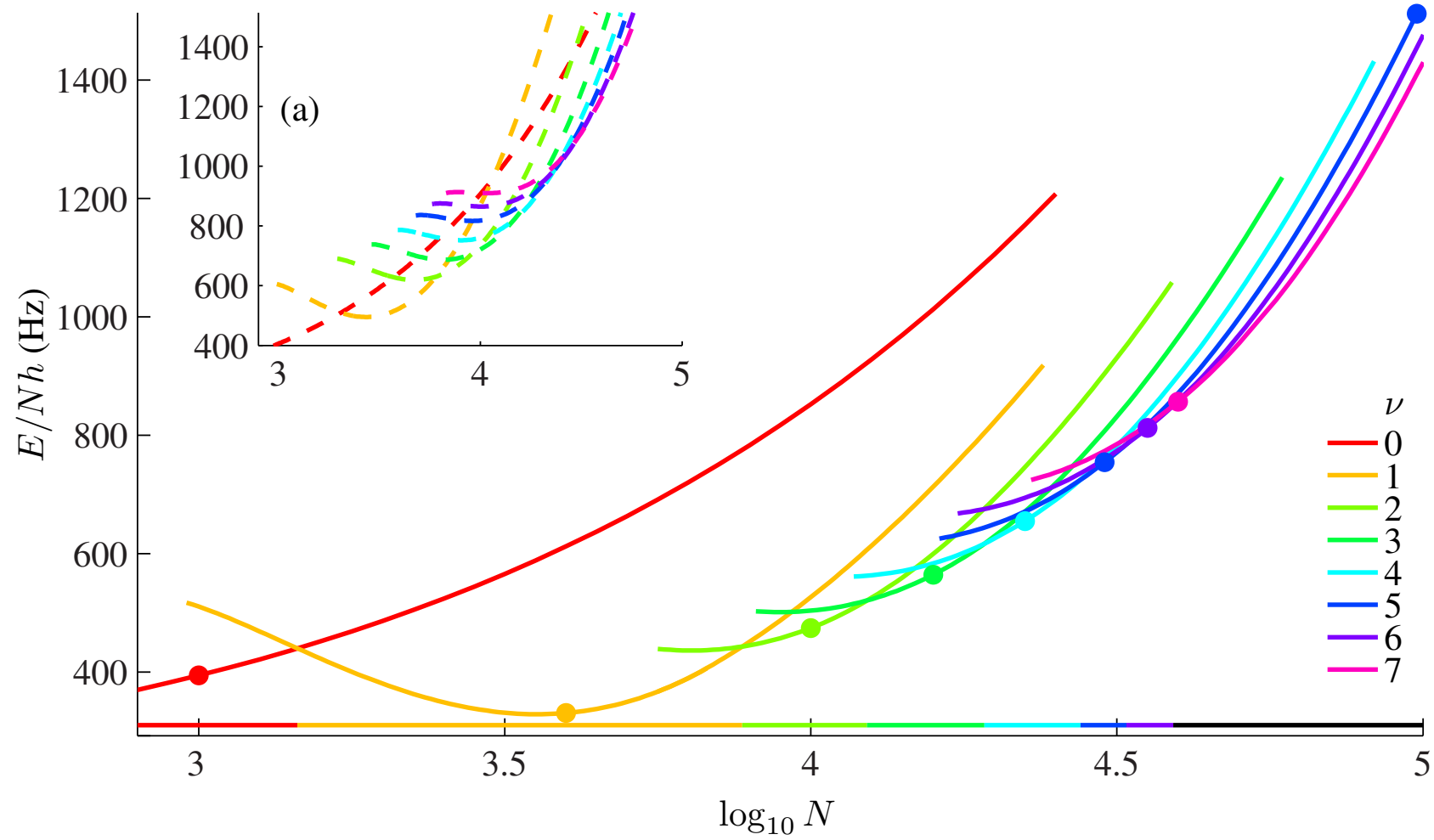
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Stationary states in a trap

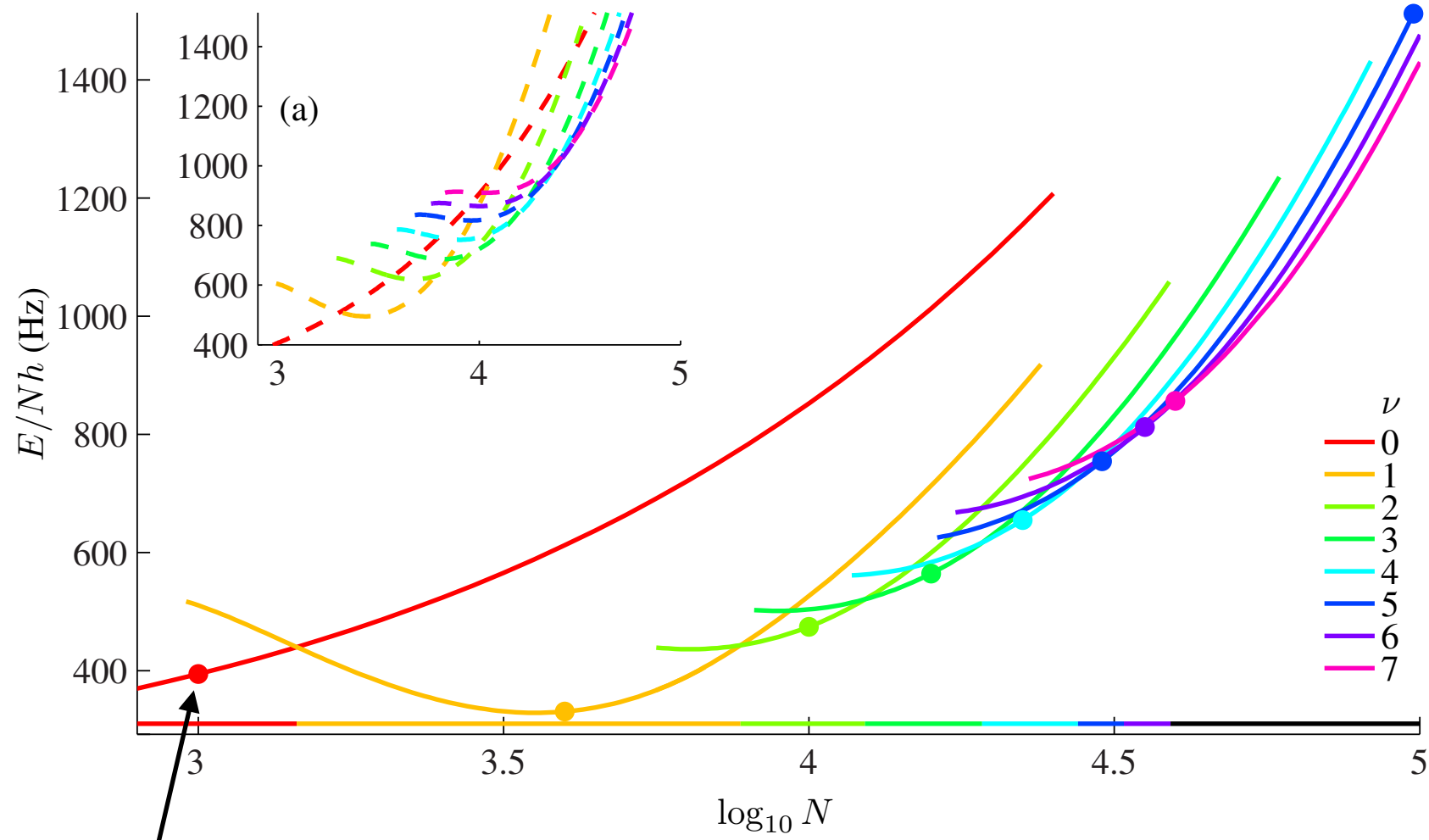


Dy-164 $a_s = 70a_0$, trap: radial=60Hz, axial=300Hz

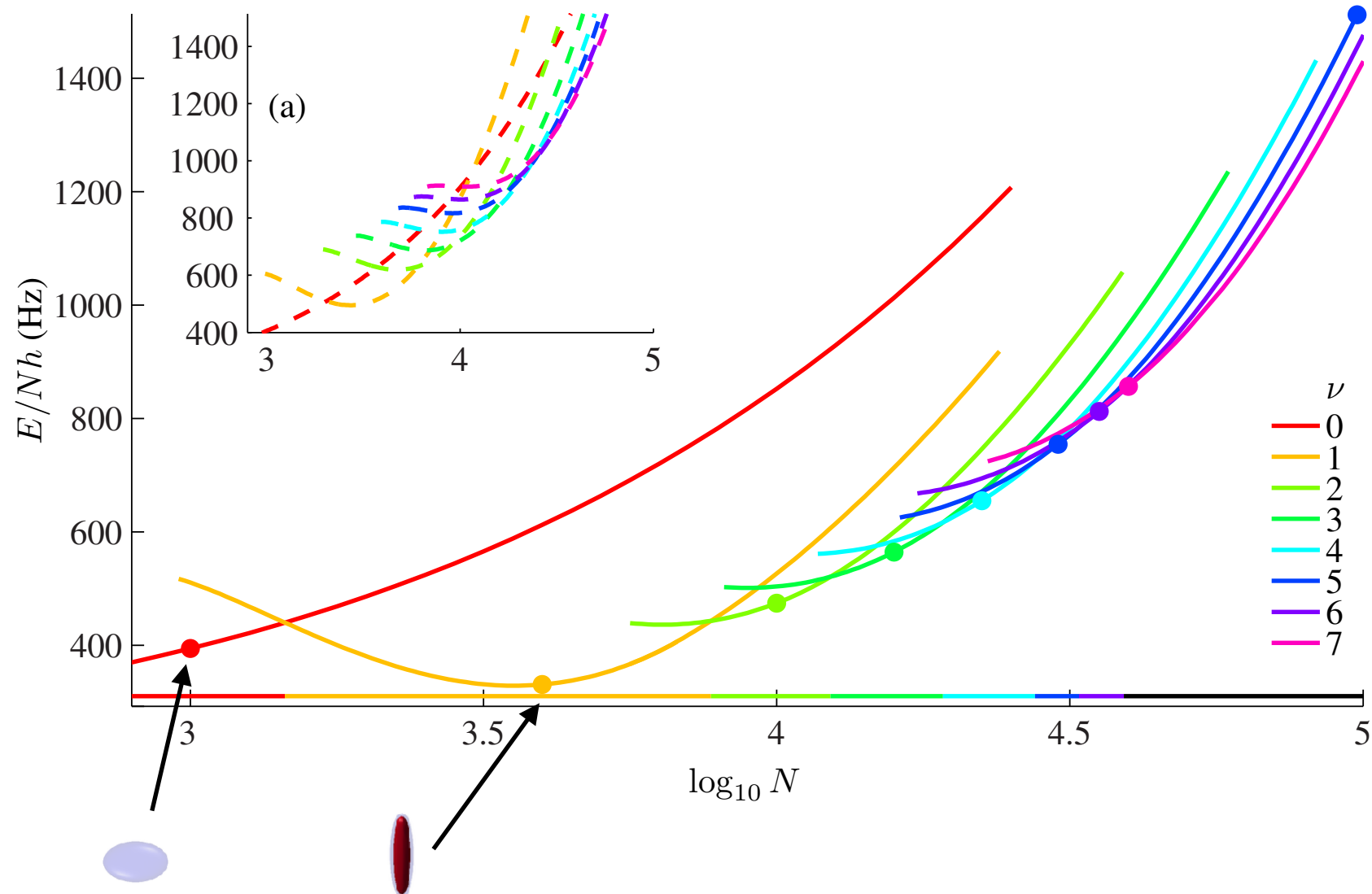
Stationary state energies



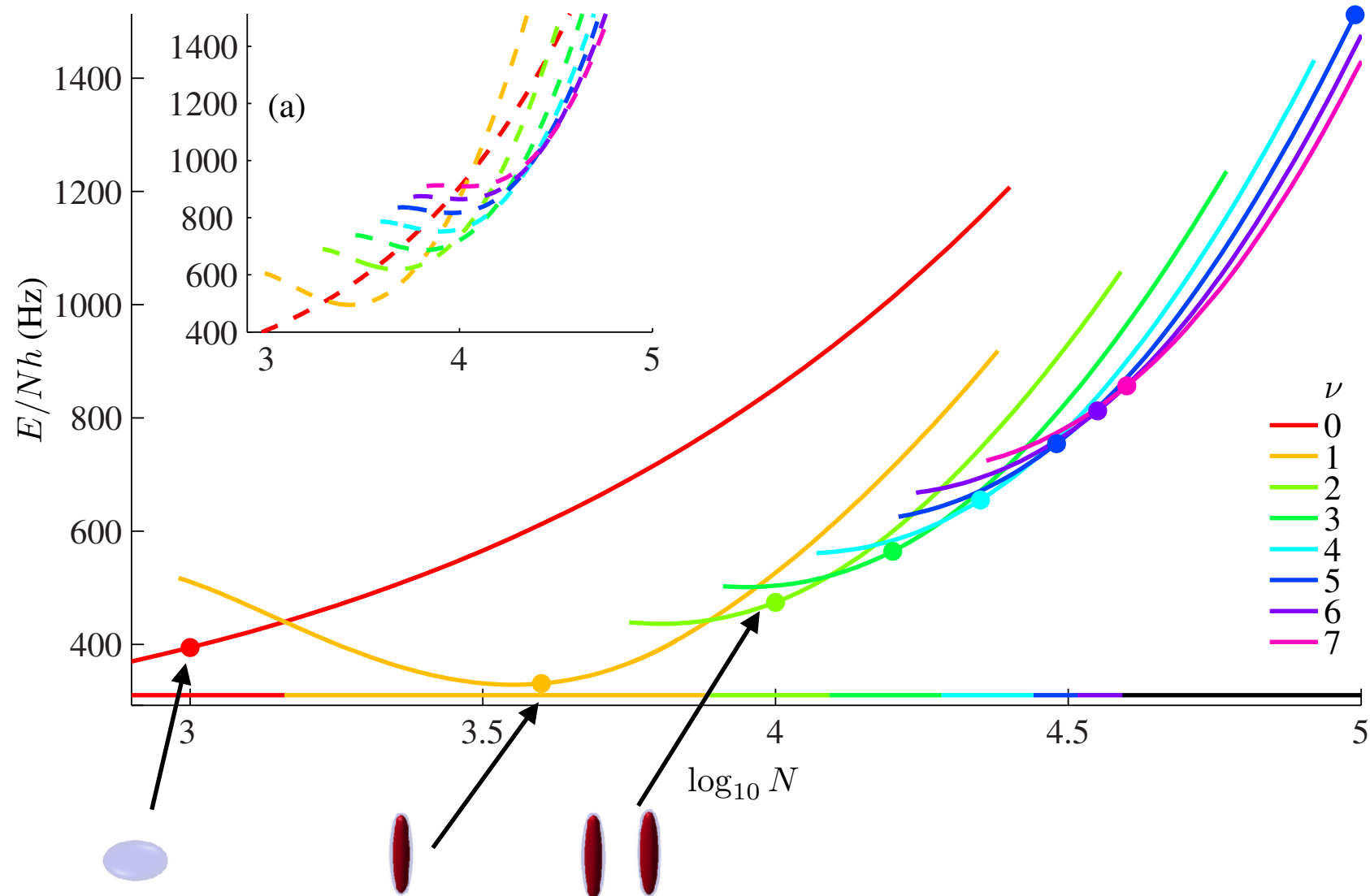
Stationary state energies



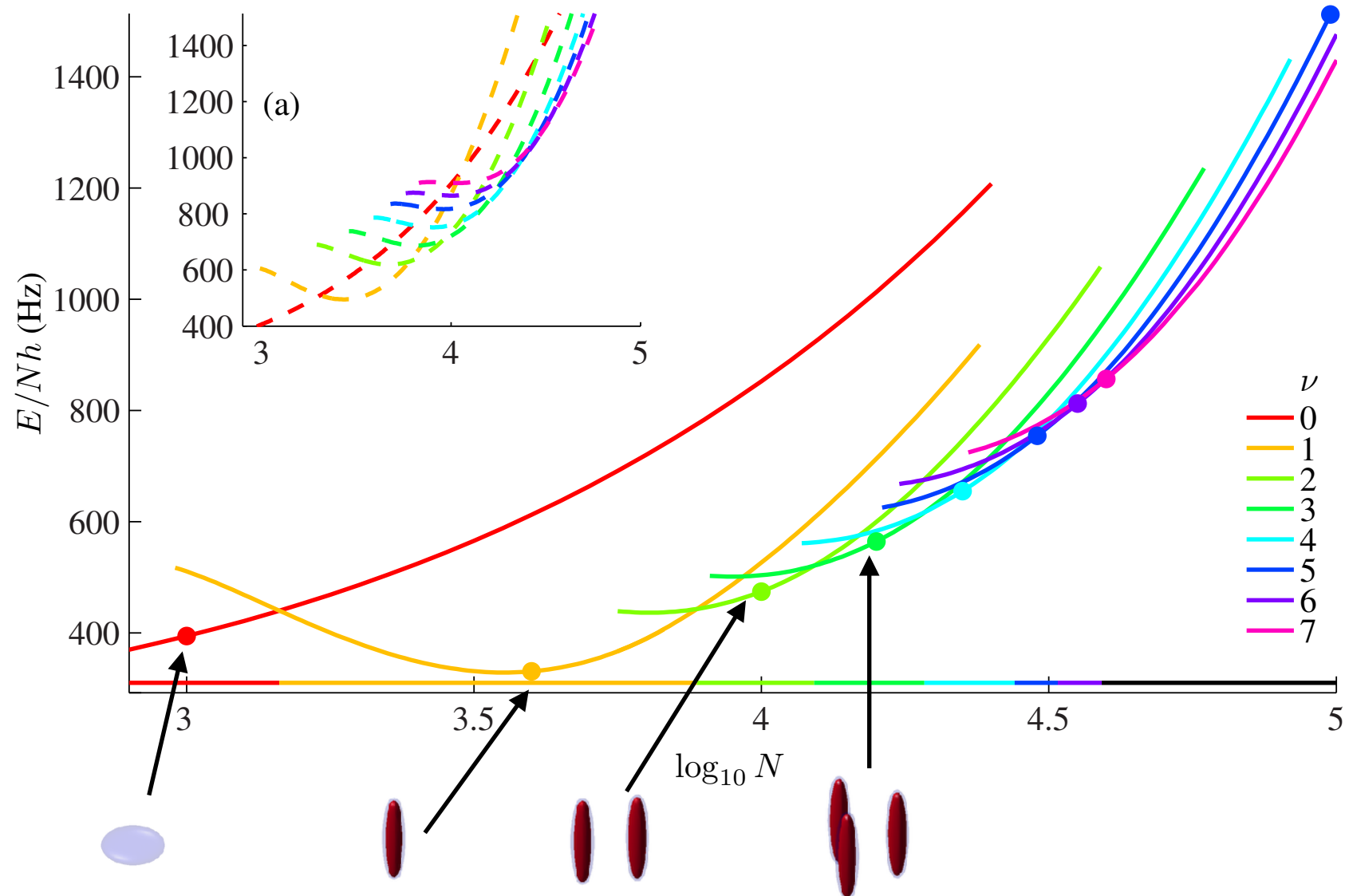
Stationary state energies



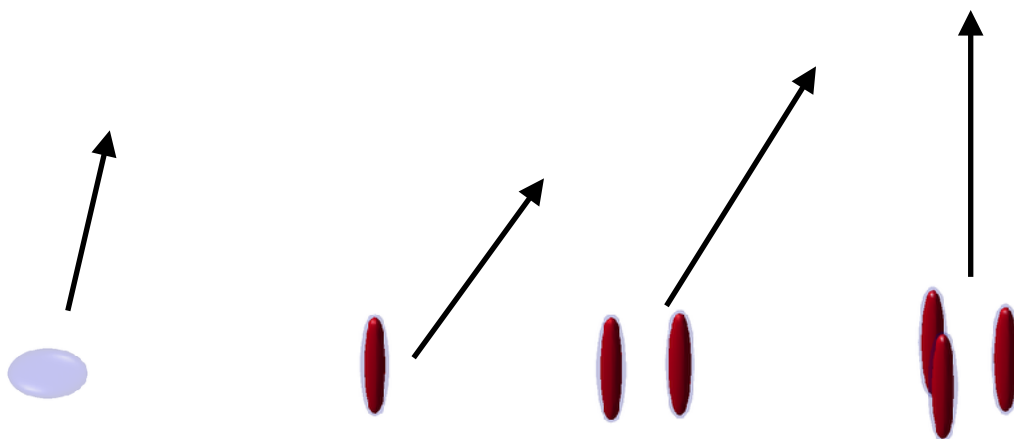
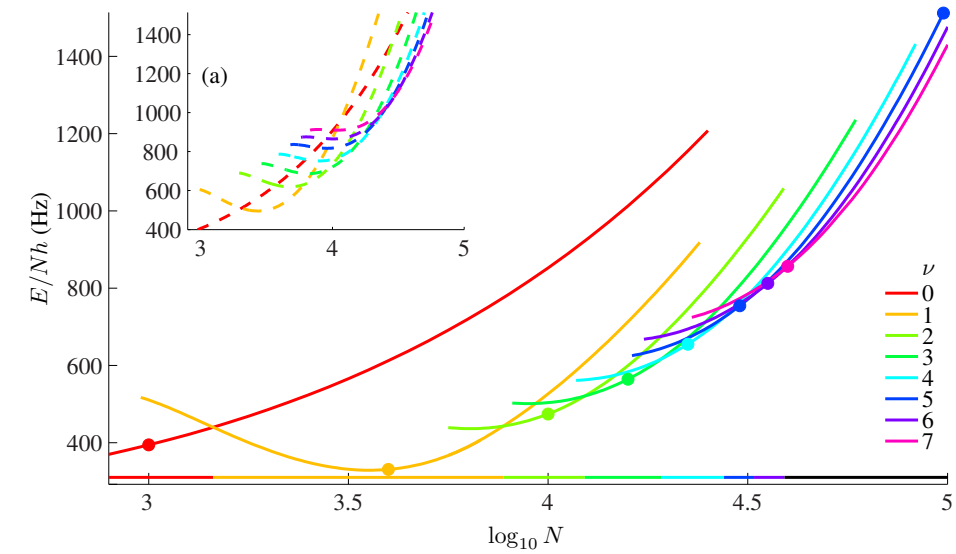
Stationary state energies



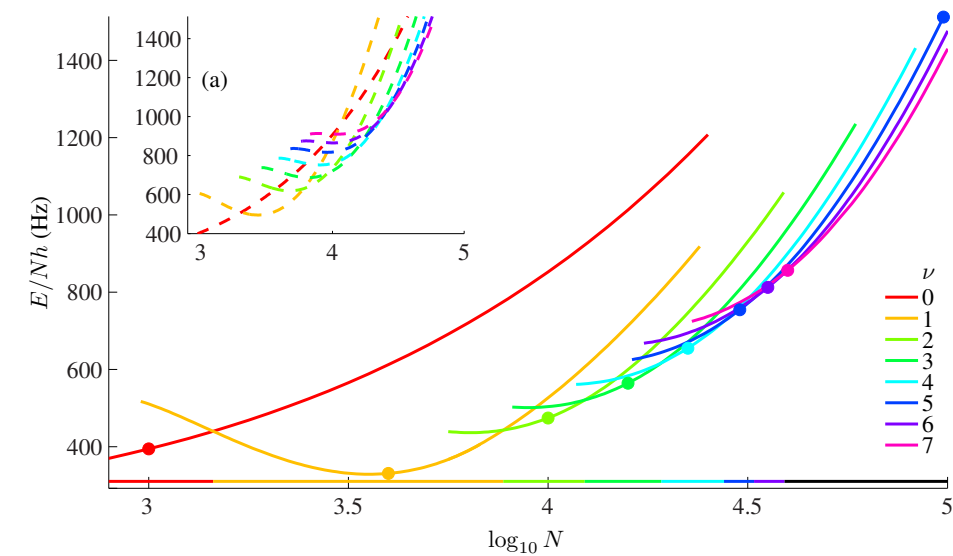
Stationary state energies



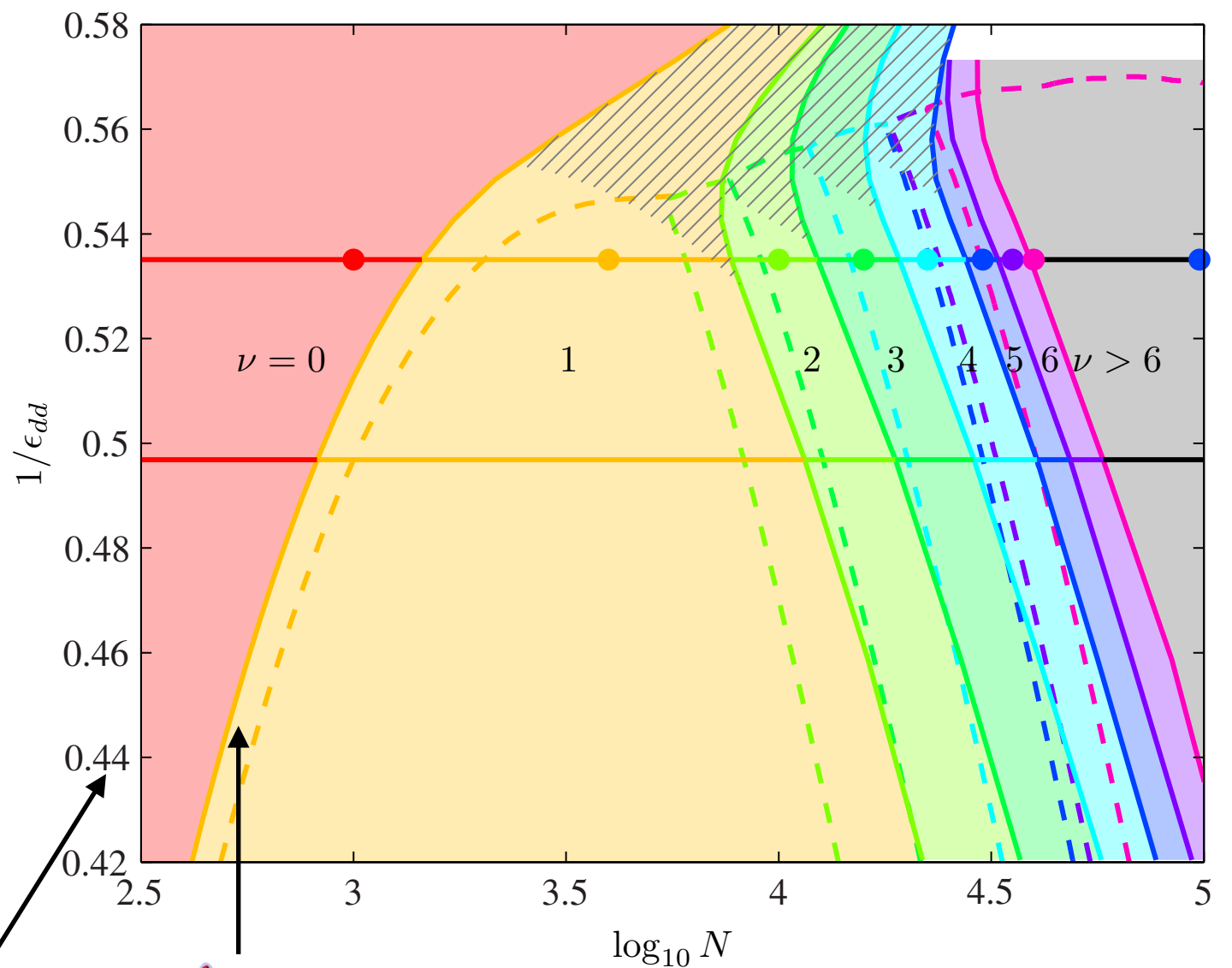
Stationary state energies



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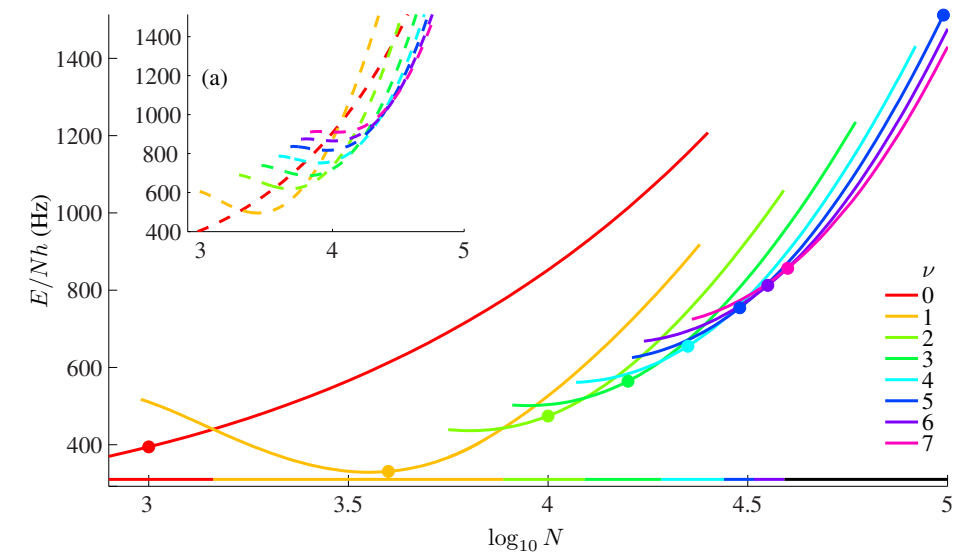
Dipole dominated



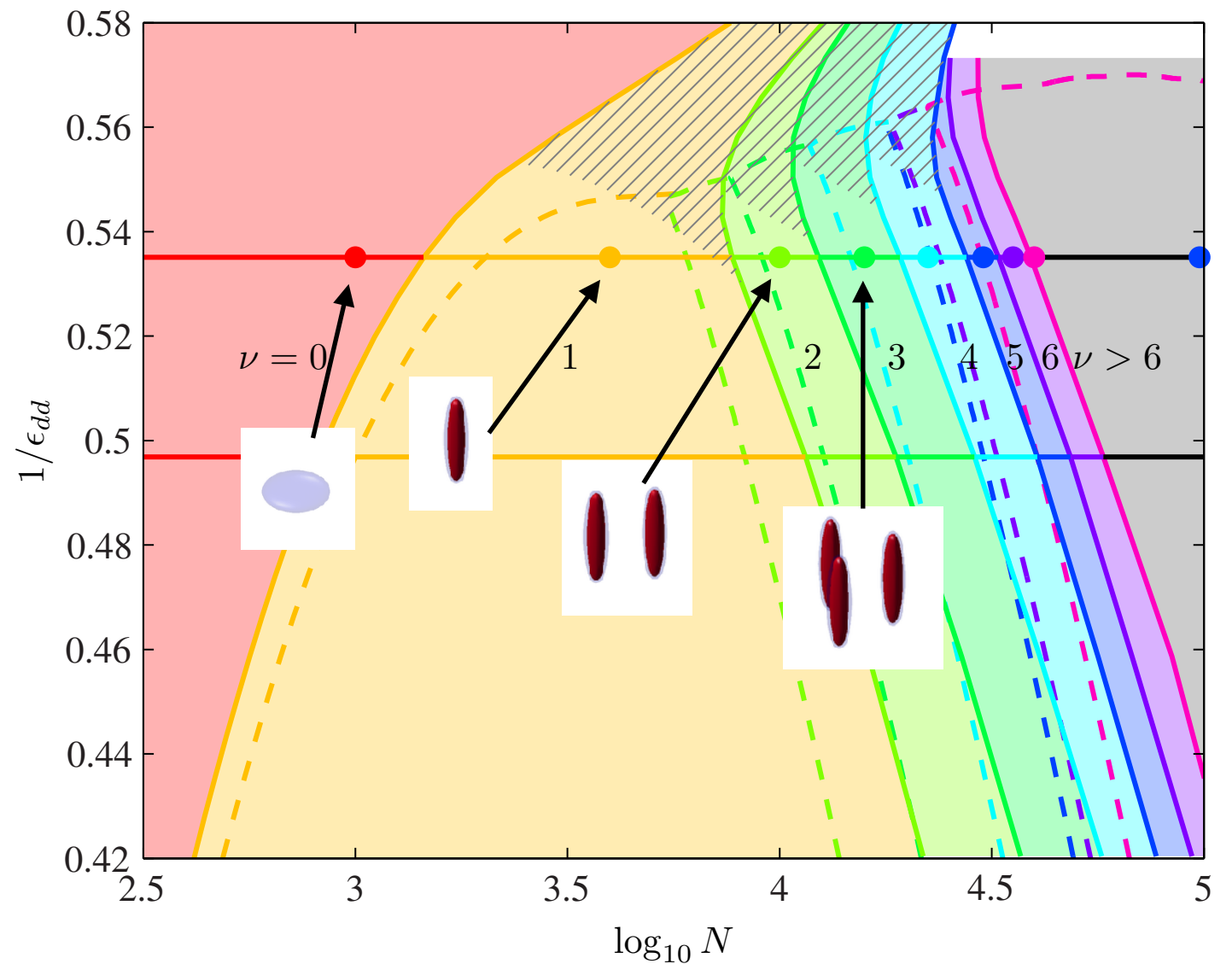
Atom number →

Dy-164 $a_s = 70a_0$, trap: radial=60Hz, axial=300Hz

Stationary state energies



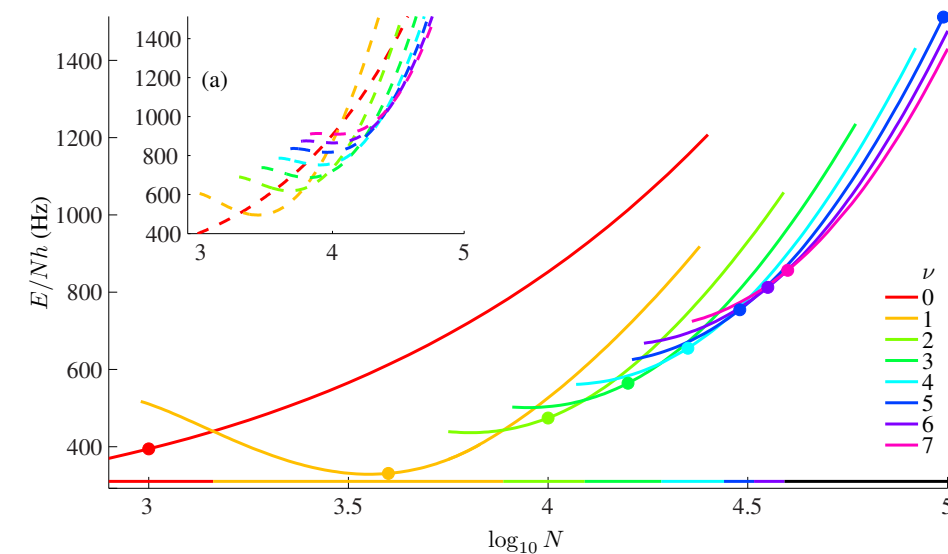
Dipole dominated



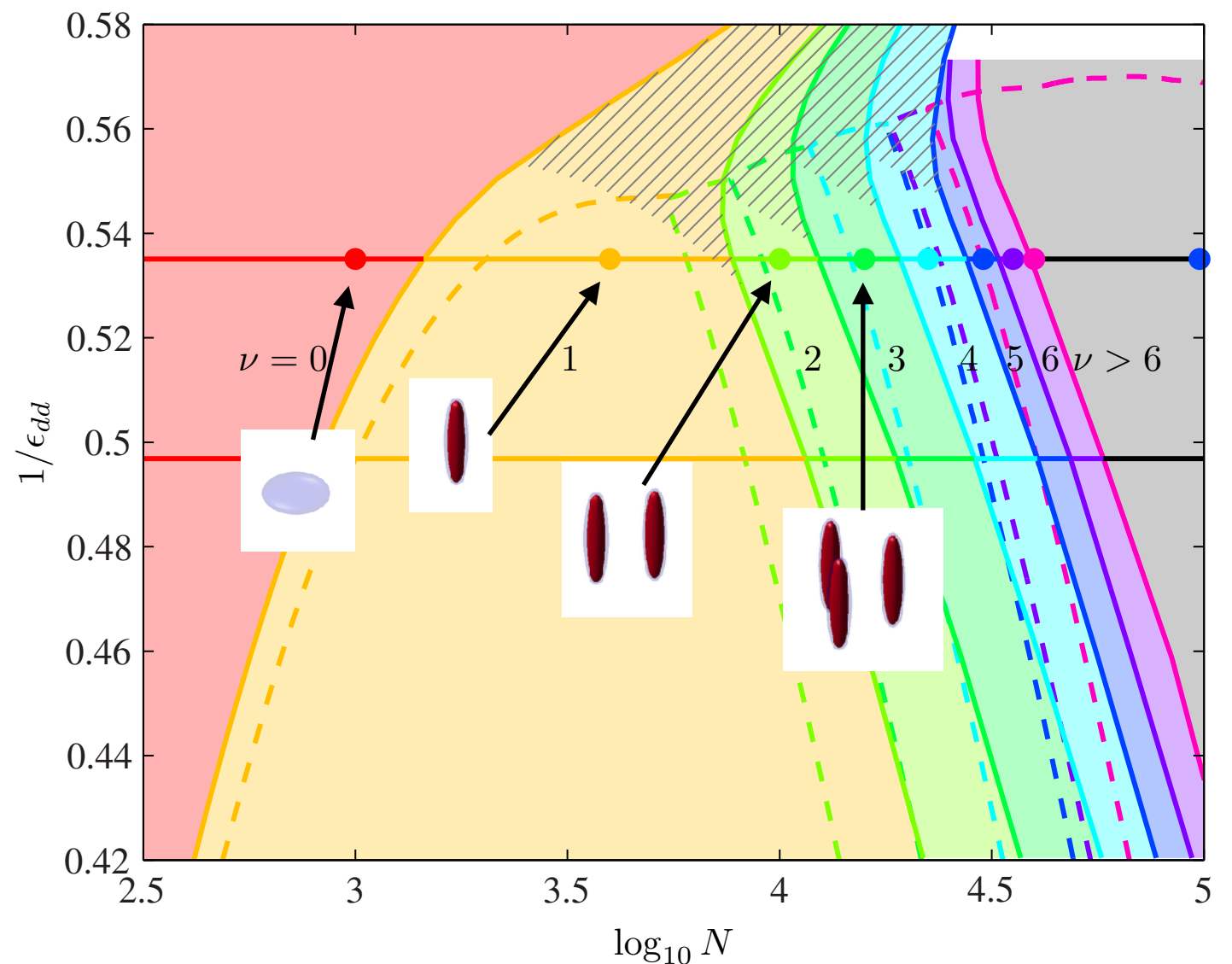
Atom number \longrightarrow

Dy-164 $a_s = 70a_0$, trap: radial=60Hz, axial=300Hz

Stationary state energies



Dipole dominated



Atom number \longrightarrow

Dy-164 $a_s = 70a_0$, trap: radial=60Hz, axial=300Hz

D. Baillie and P. B. Blakie, [PRL **121**, 195301 \(2018\)](#)

Computational physics behind our work

Nonlinear differential equations

- Droplet crystals are solutions of the dipolar Gross-Pitaevskii equation (nonlinear eigenvalue equation)

$$\mu\Psi = \left[\underbrace{-\frac{\hbar^2 \nabla^2}{2M} + V_{\text{tr}}}_{\text{Linear parts}} + \underbrace{g_s |\Psi|^2 + \int d\mathbf{x}' U_{dd}(\mathbf{x} - \mathbf{x}') |\Psi(\mathbf{x}')|^2 + \gamma_{\text{QF}} |\Psi|^3}_{\text{Nonlinear parts}} \right] \Psi$$

Subject to the constraint $\int d\mathbf{x} |\Psi|^2 = N$

$$V_{\text{tr}} = \frac{1}{2} M \omega_\rho^2 (x^2 + y^2 + \lambda^2 z^2),$$

$$U_{dd}(\mathbf{r}) = \frac{3g_{dd}}{4\pi} \frac{1 - 3\cos^2 \theta}{r^3},$$

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- Significant work from mathematics and physics communities
- Few parameters: results can *easily* be verified by others

Nonlinear differential equations

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Today's focus

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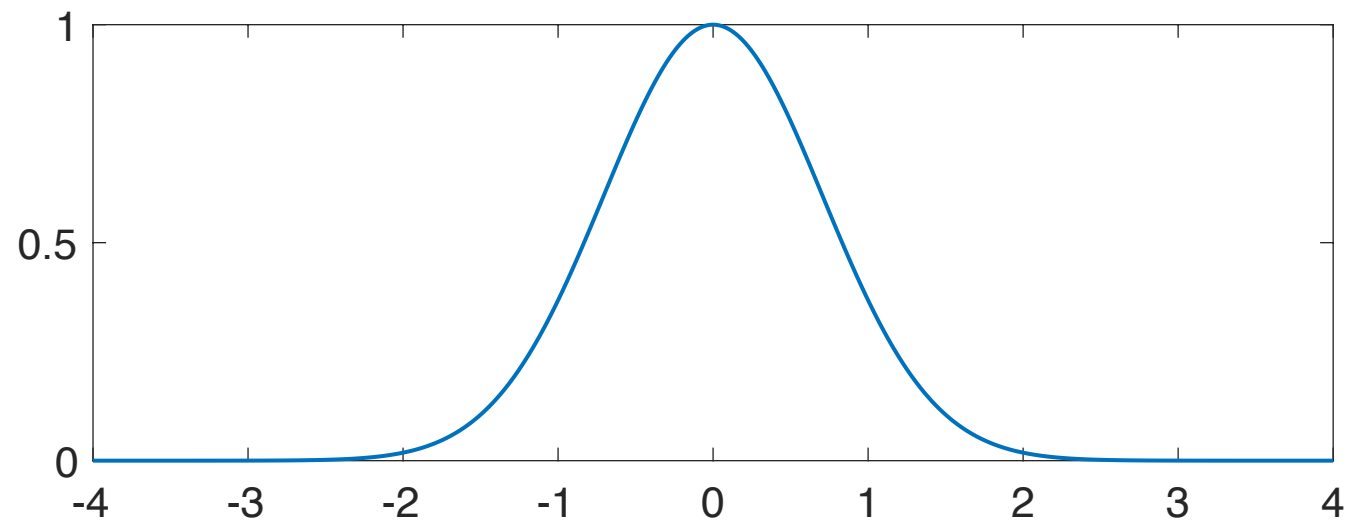
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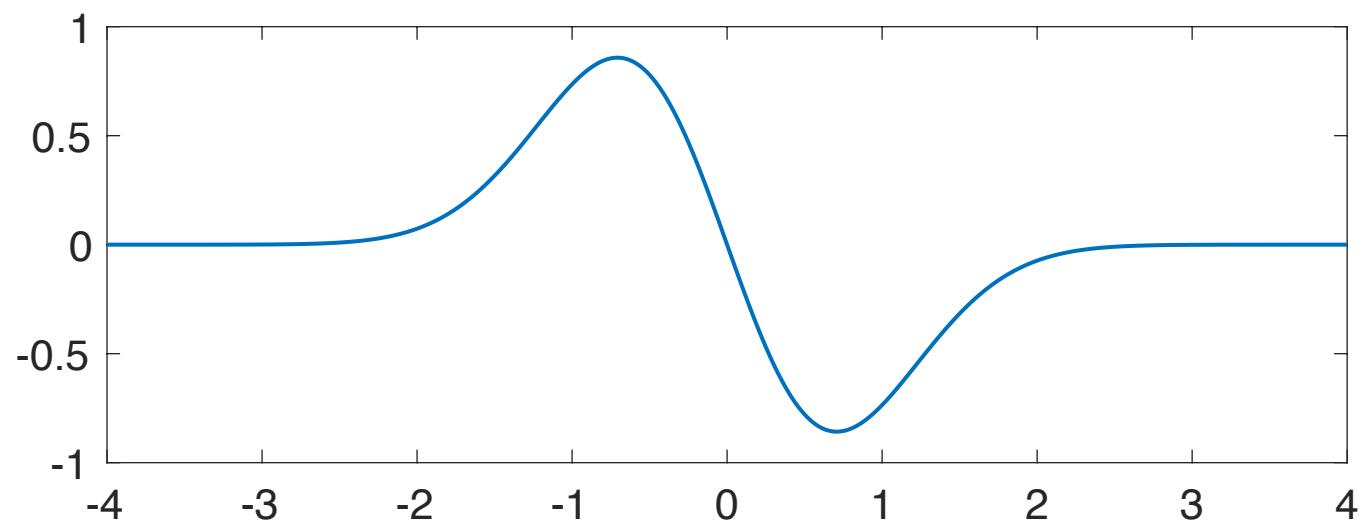
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Derivatives

Derivatives



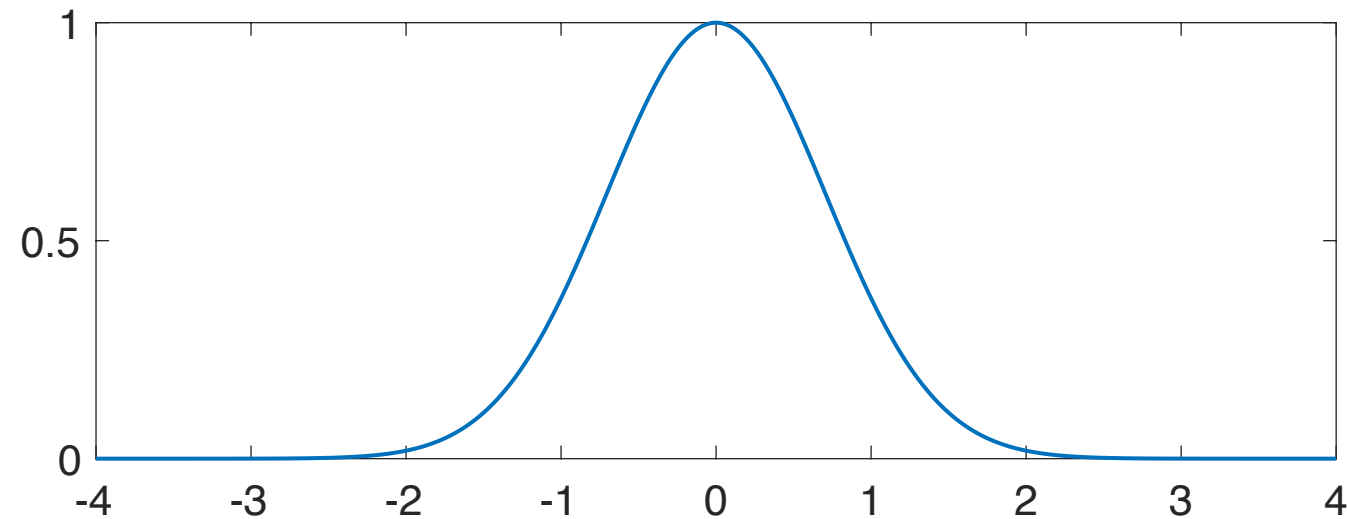
$$f(x) = e^{-x^2}$$



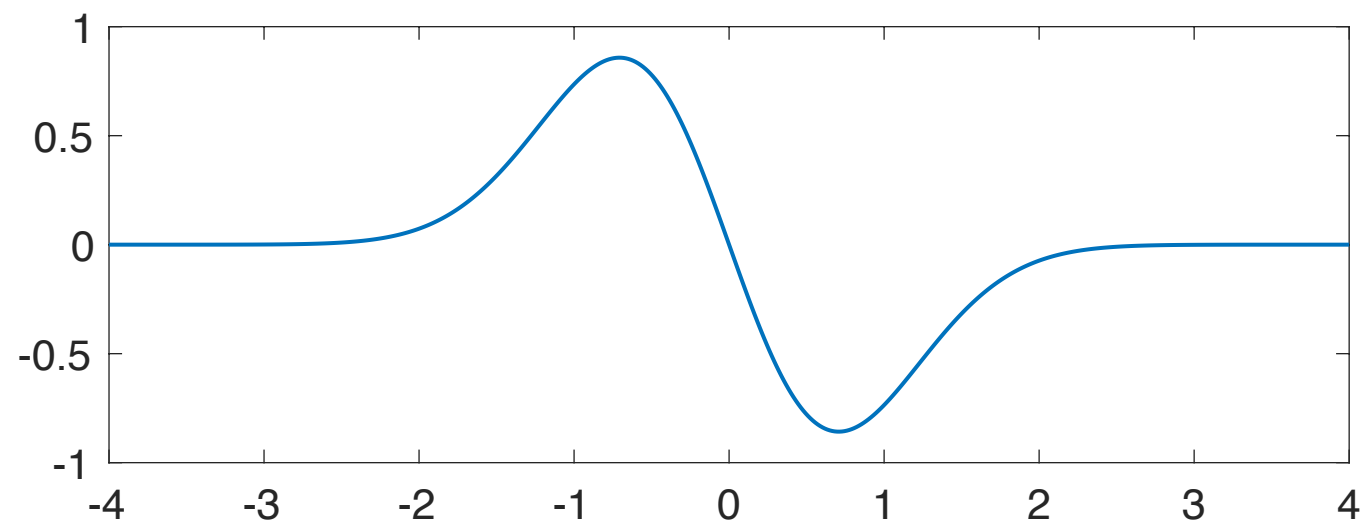
$$\frac{df}{dx} = -2xe^{-x^2}$$

Derivatives

Finite Difference Approach



$$f(x) = e^{-x^2}$$

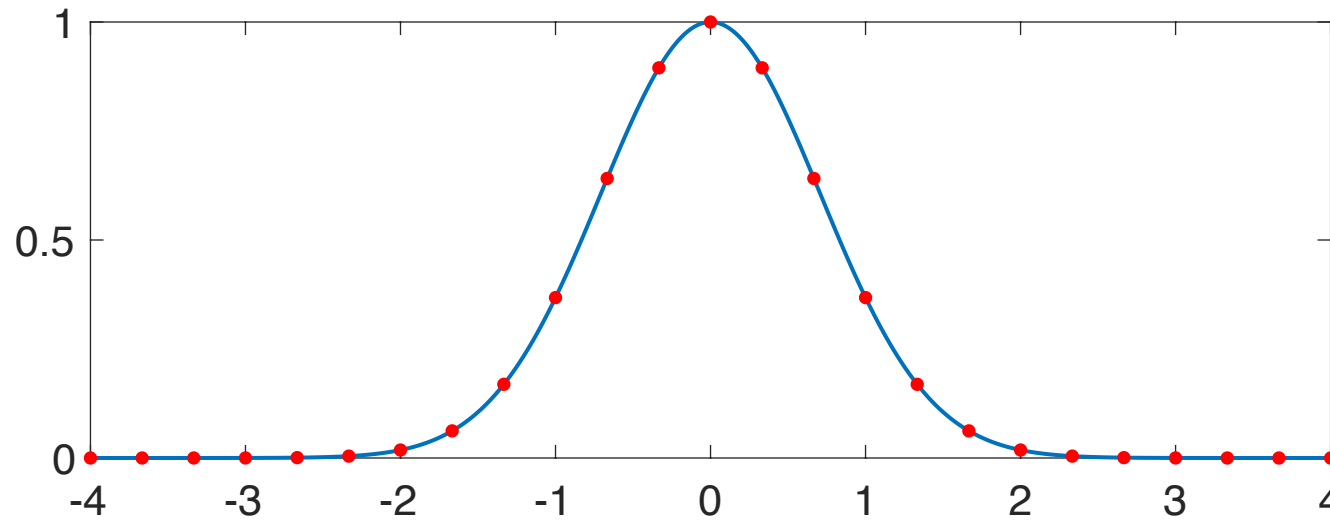


$$\frac{df}{dx} = -2xe^{-x^2}$$

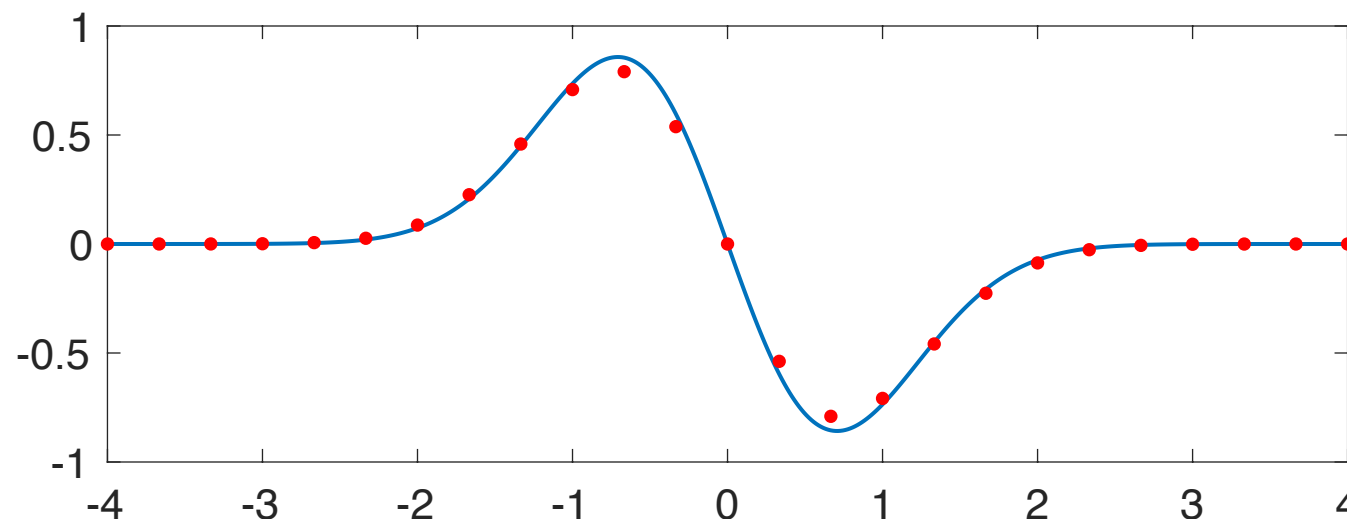
Derivatives

Finite Difference Approach

Sample with 25 points



$$f(x) = e^{-x^2}$$



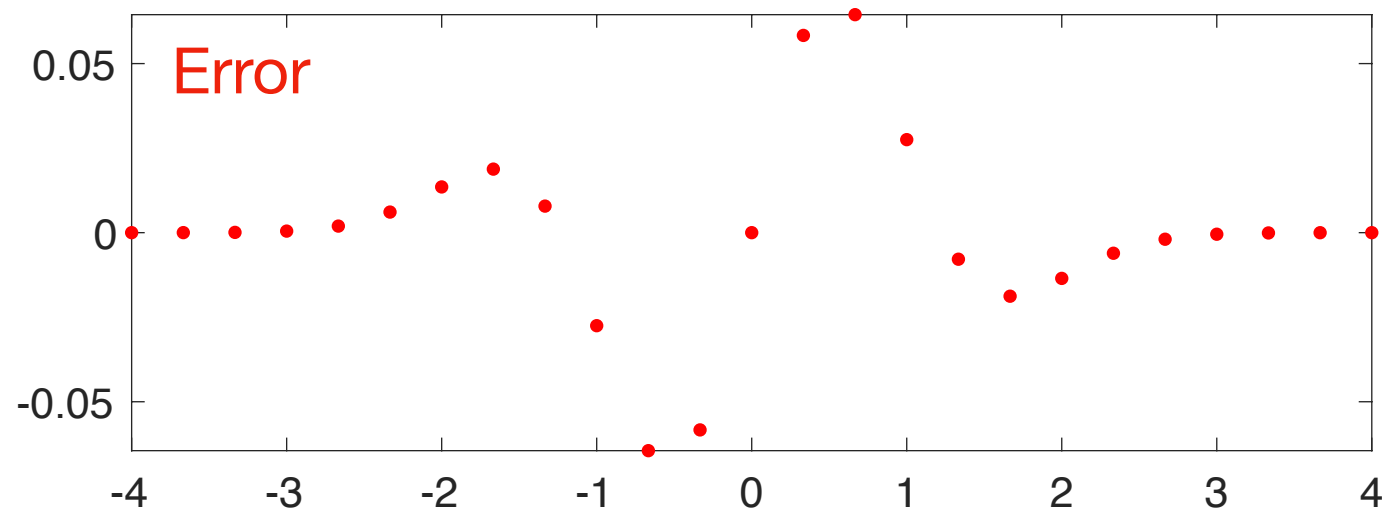
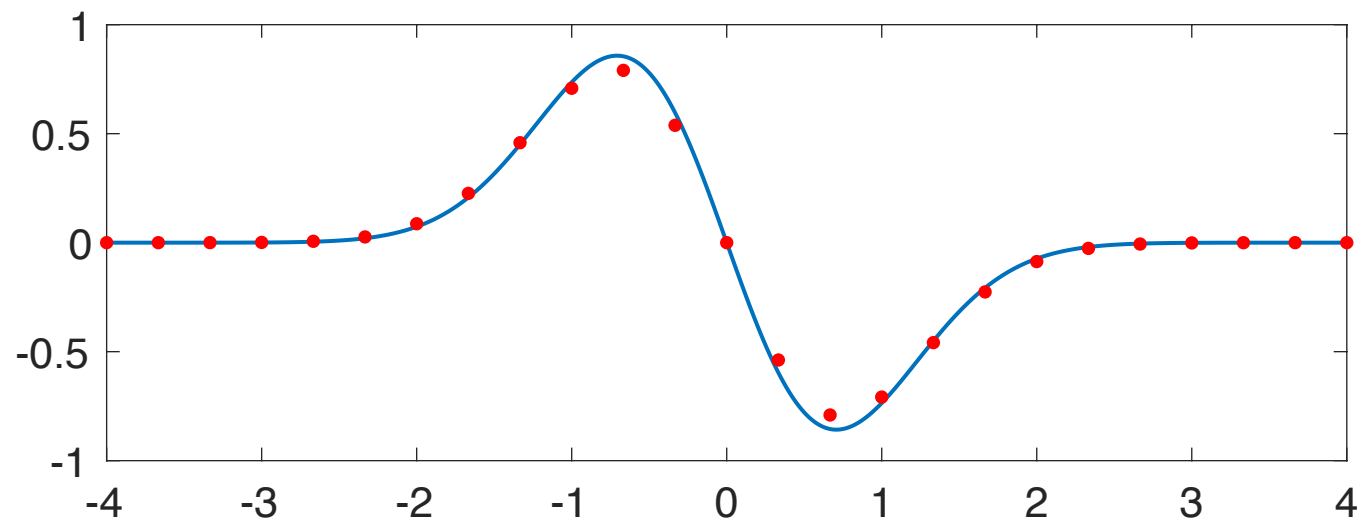
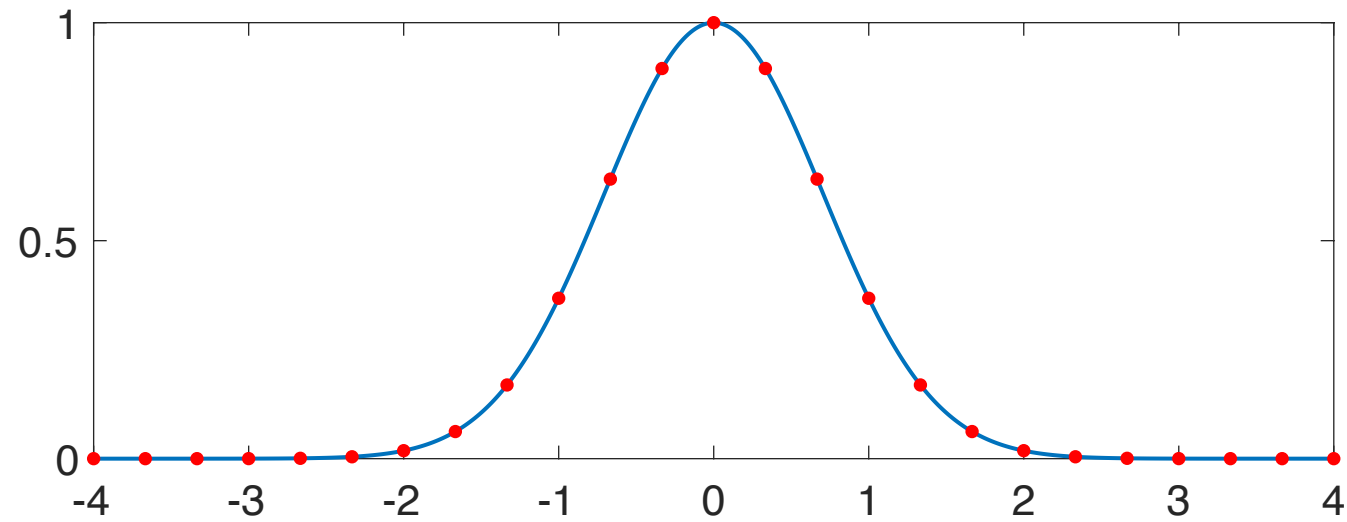
$$\frac{df}{dx} = -2xe^{-x^2}$$

Finite difference derivative

$$\frac{df}{dx} \approx \frac{f(x + \Delta x) - f(x - \Delta x)}{2\Delta x}$$

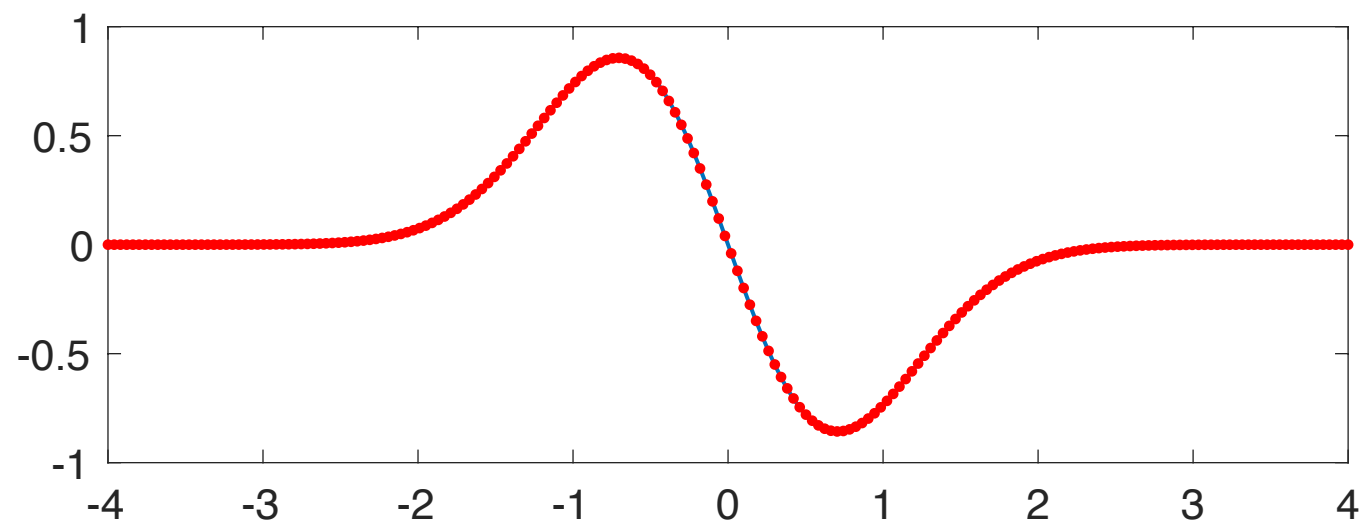
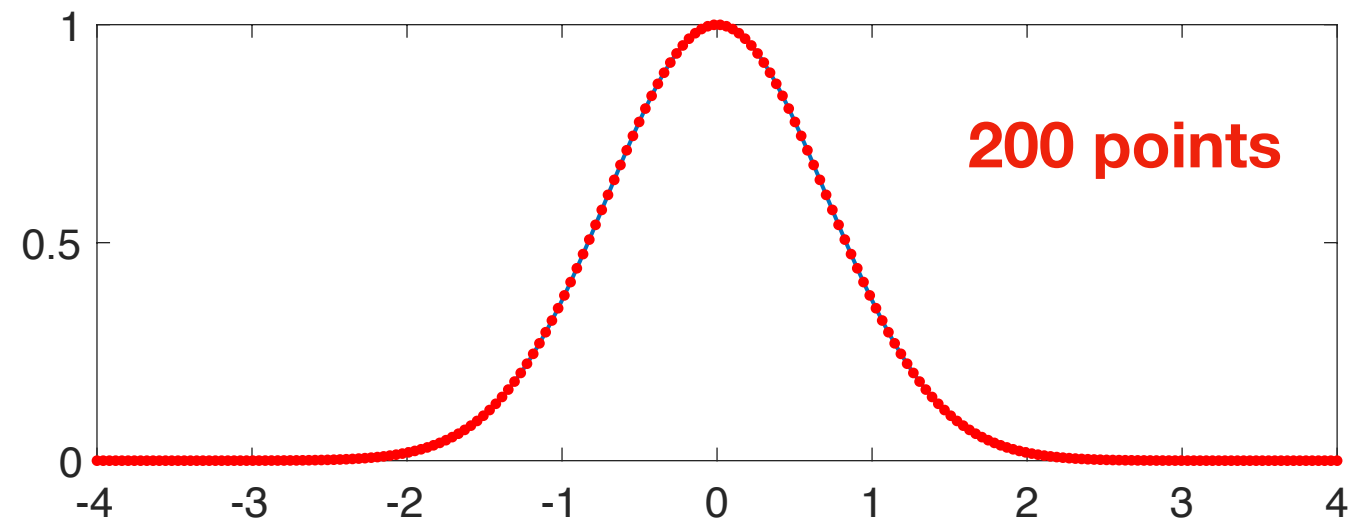
Derivatives

Finite Difference Approach



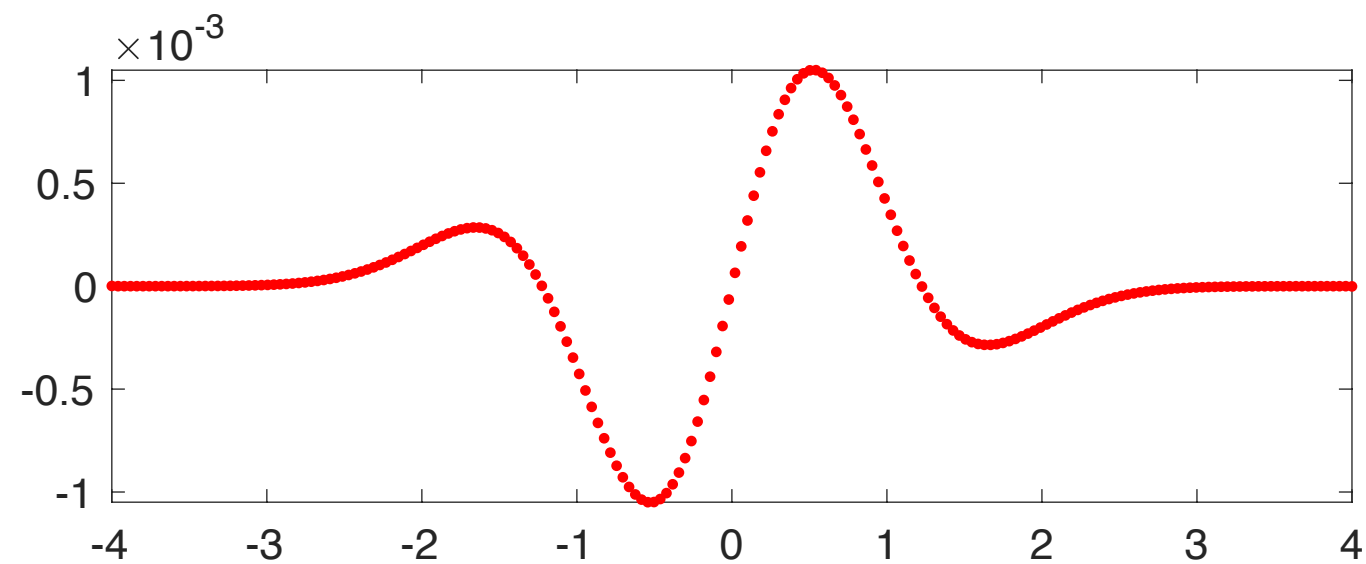
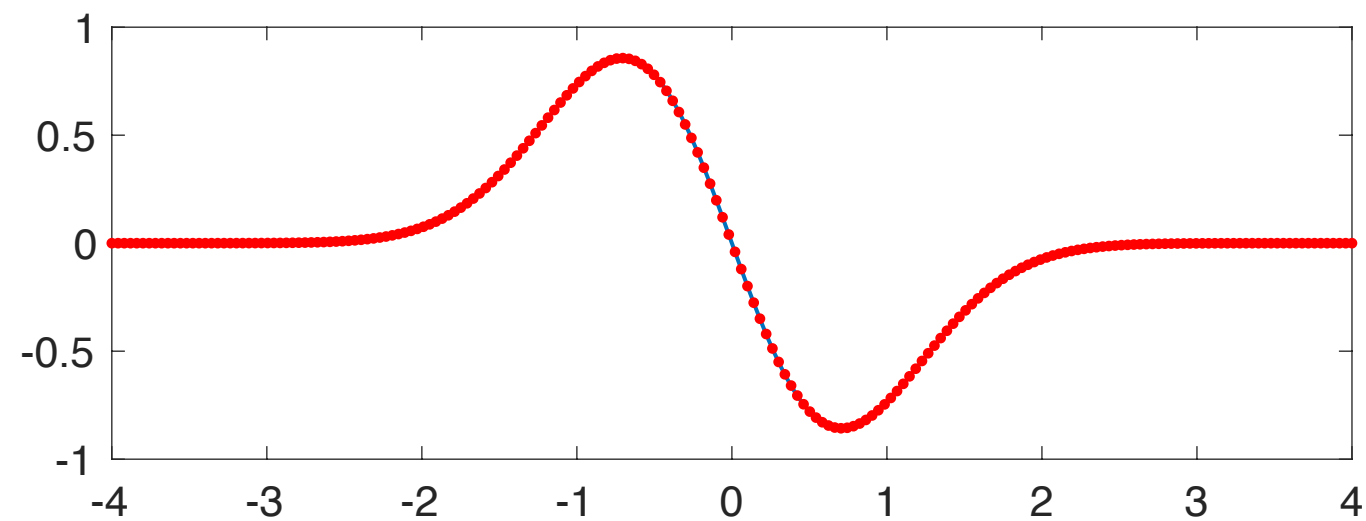
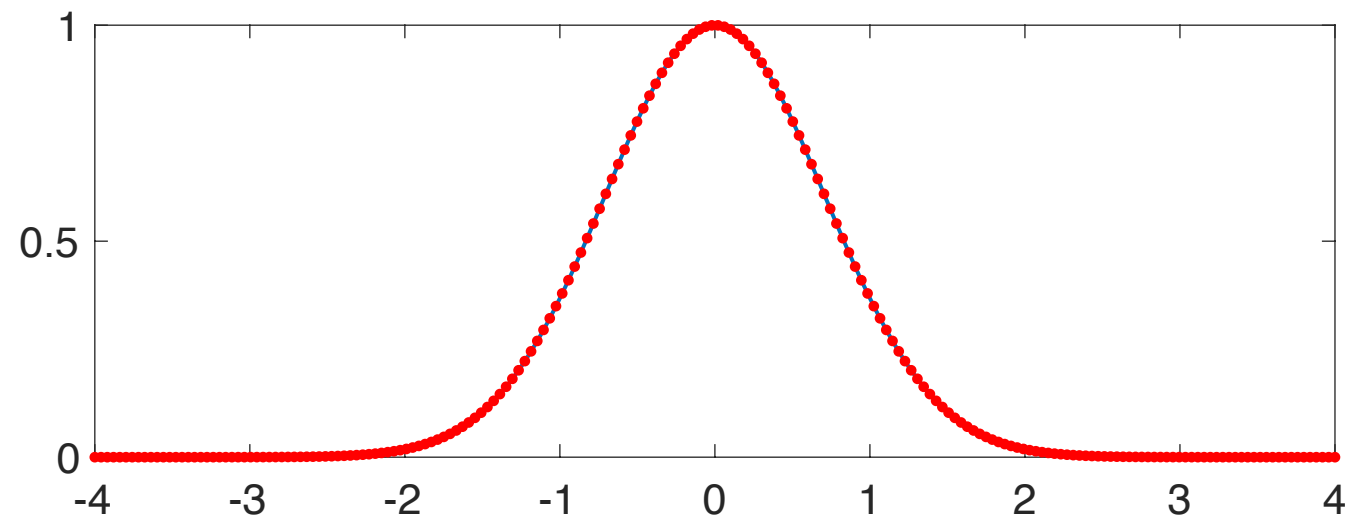
Derivatives

Finite Difference Approach



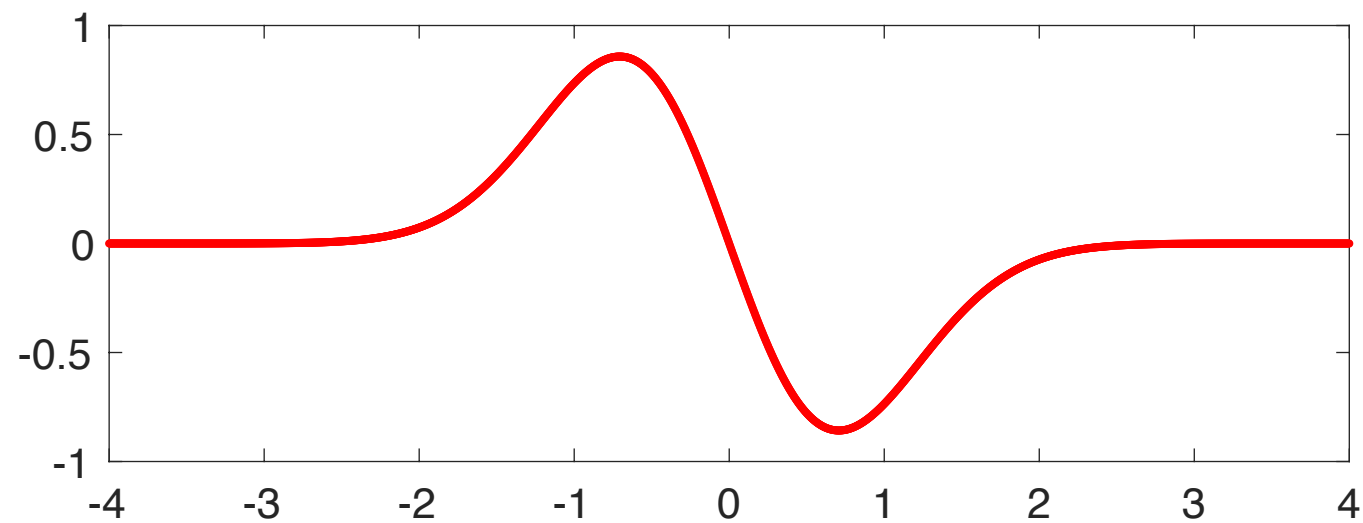
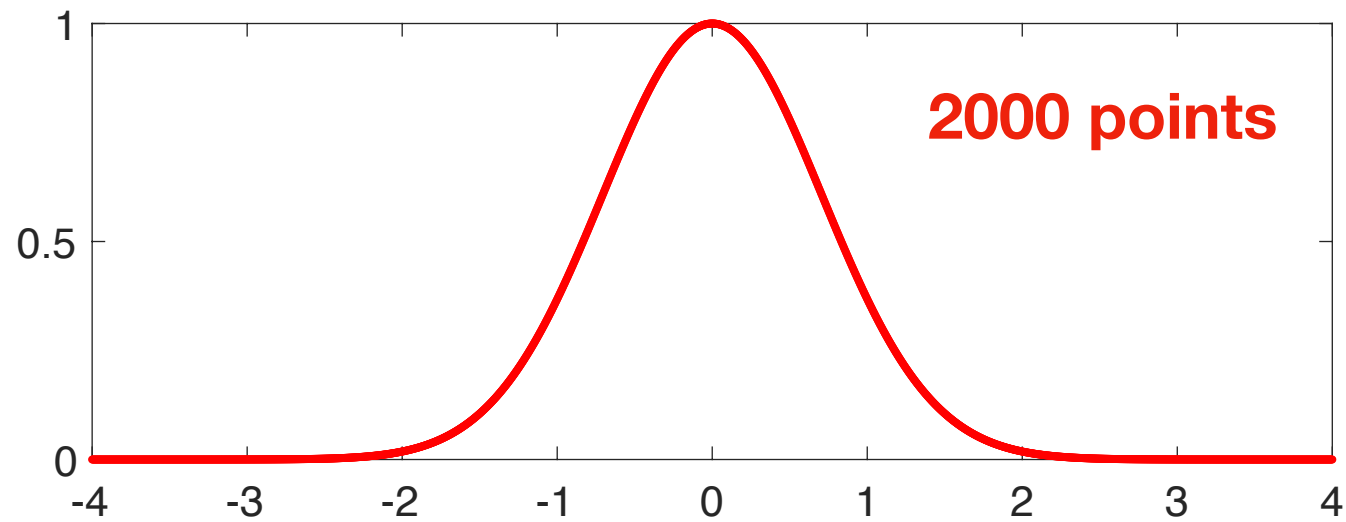
Derivatives

Finite Difference Approach

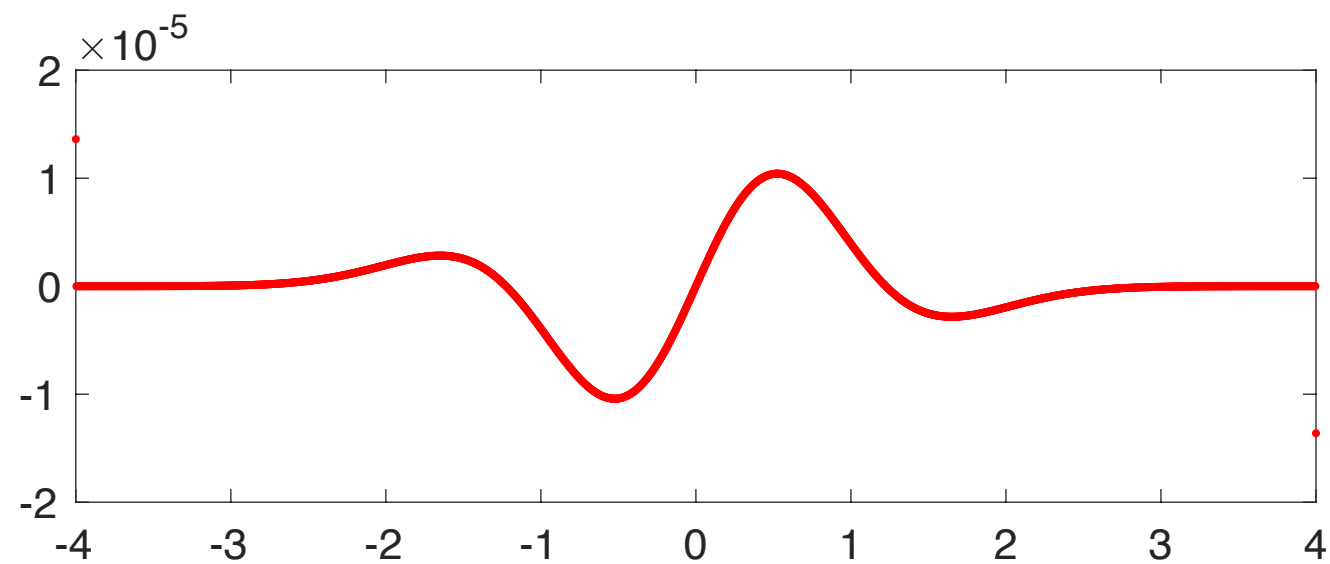
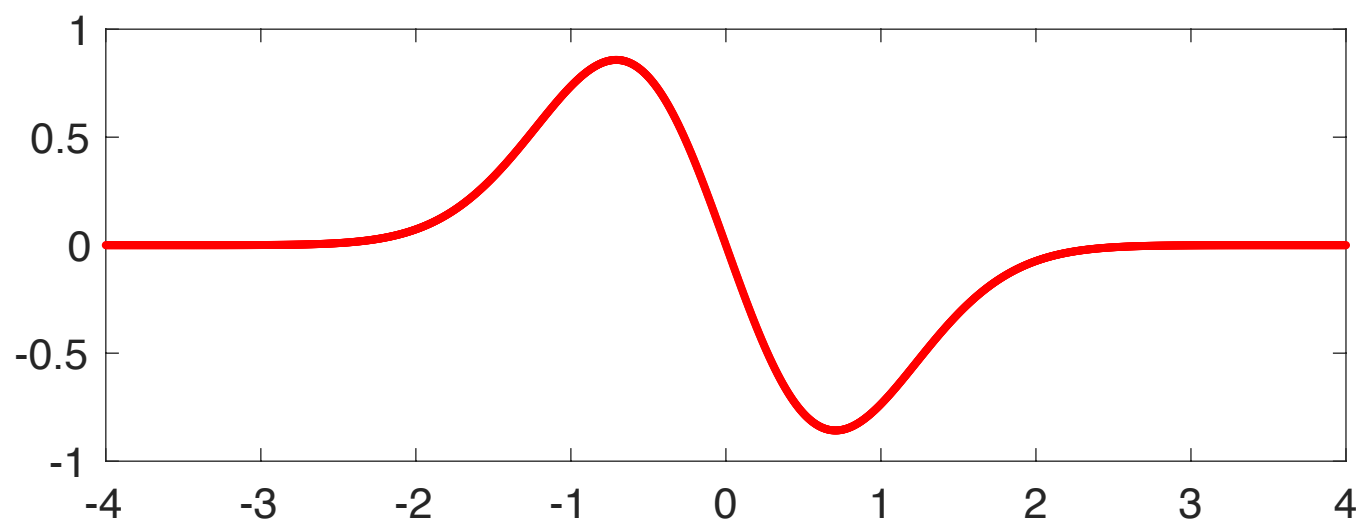
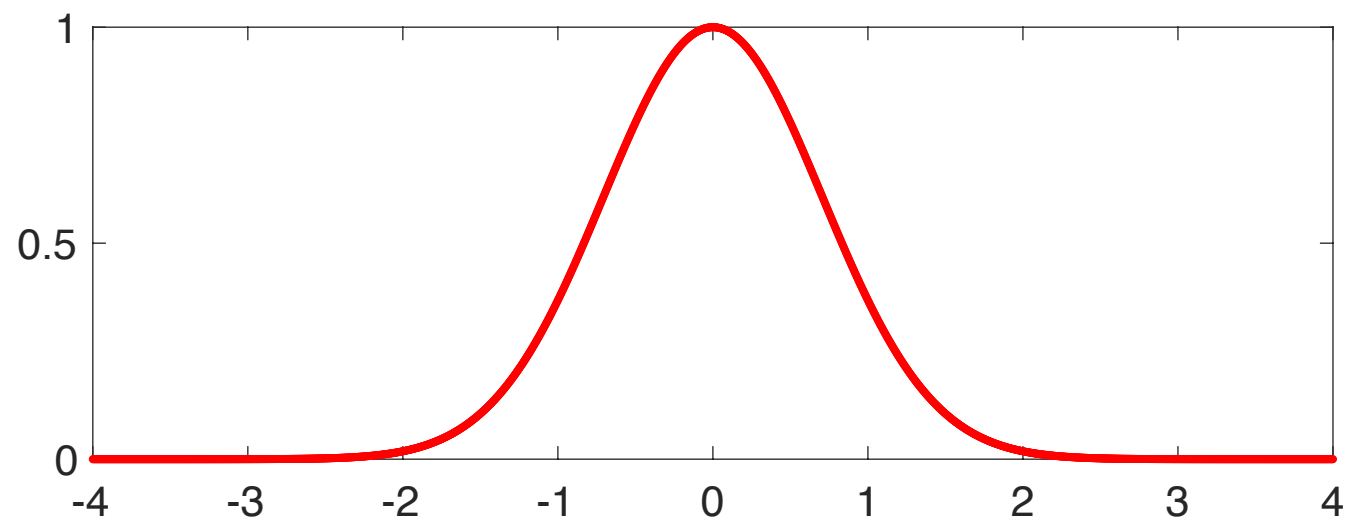


Derivatives

Finite Difference Approach

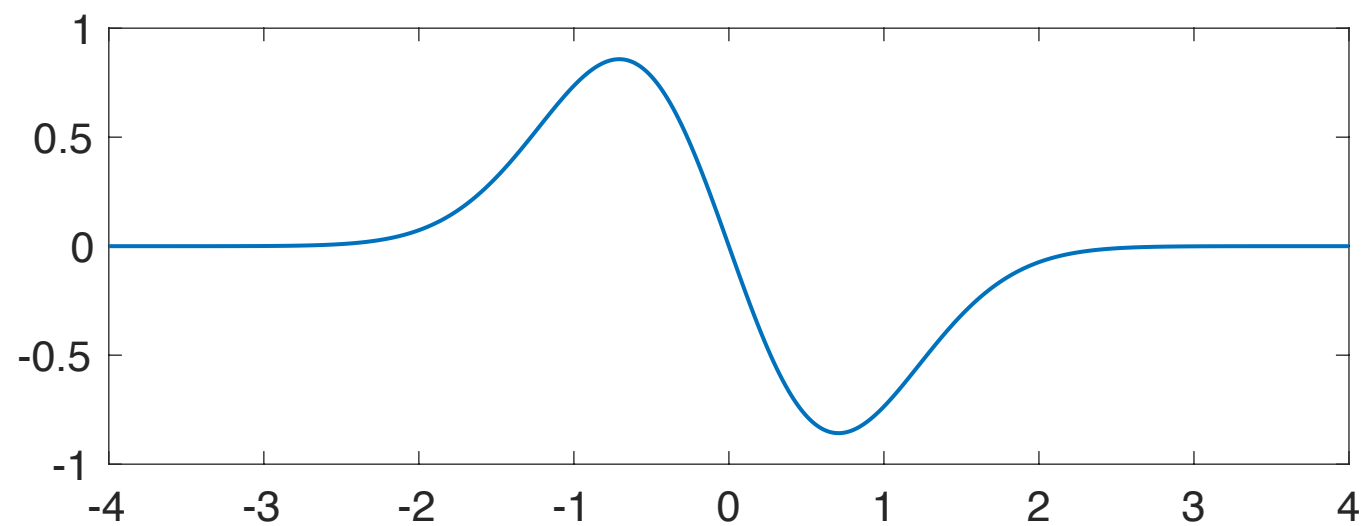
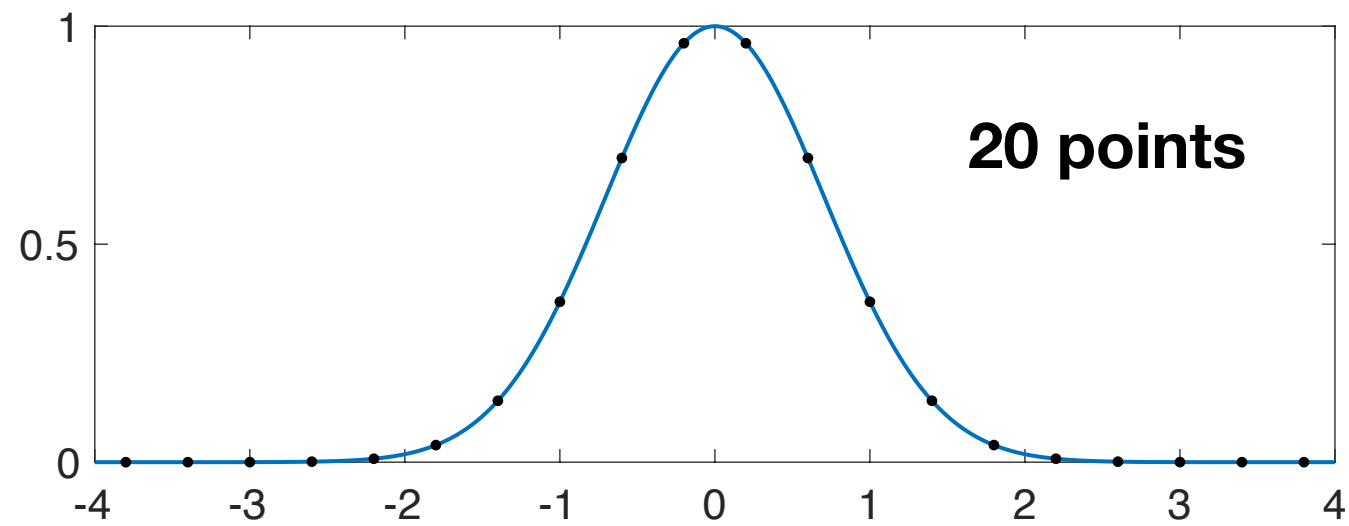


Derivatives



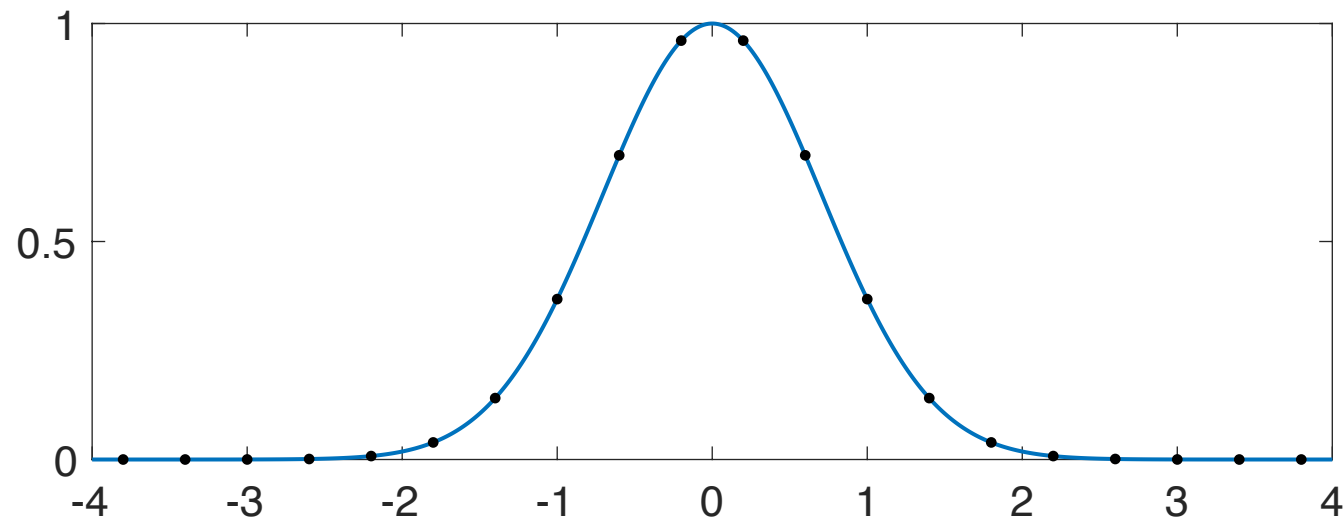
Derivatives

Fourier Approach

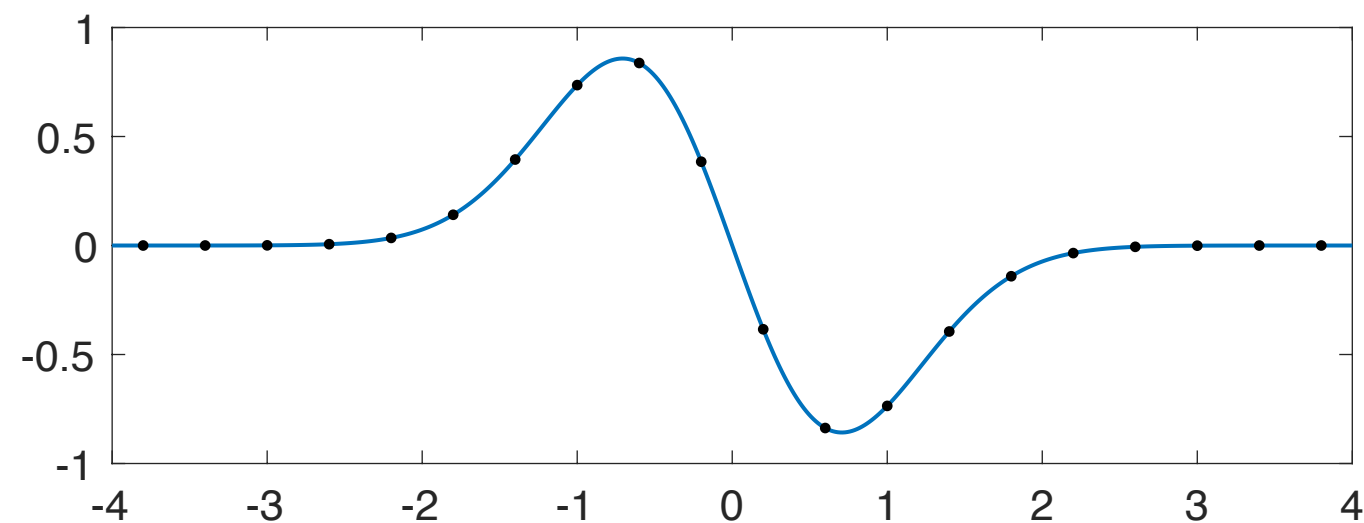


Derivatives

Fourier Approach



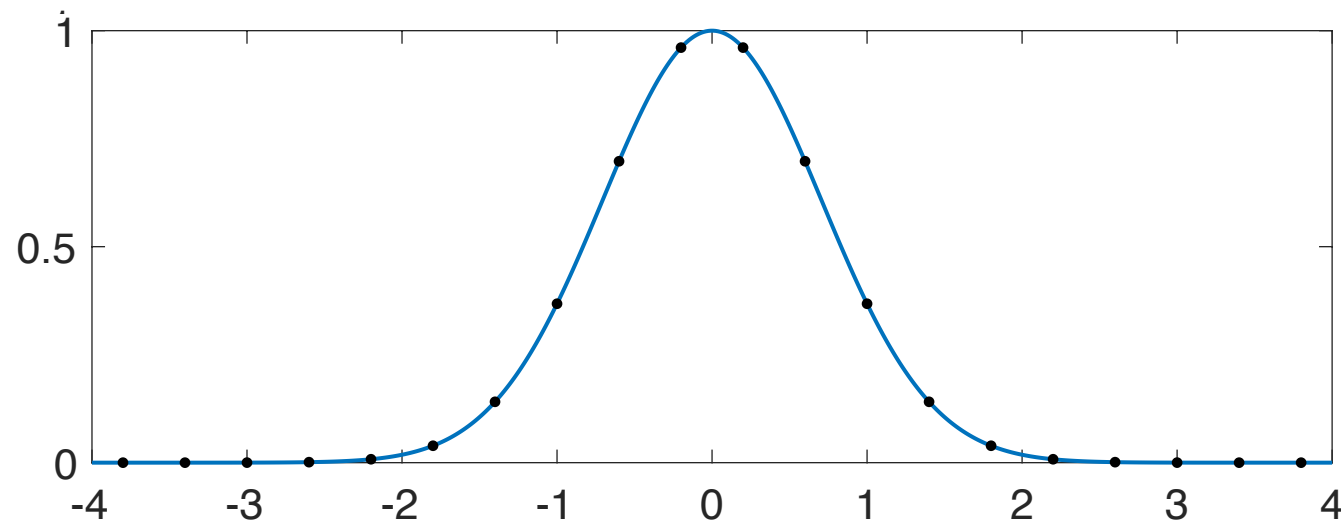
Implemented as a FFT



$\frac{df}{dx} \approx a_{11}f(x_1) + a_{12}f(x_2) + \dots a_{1N}f(x_N)$

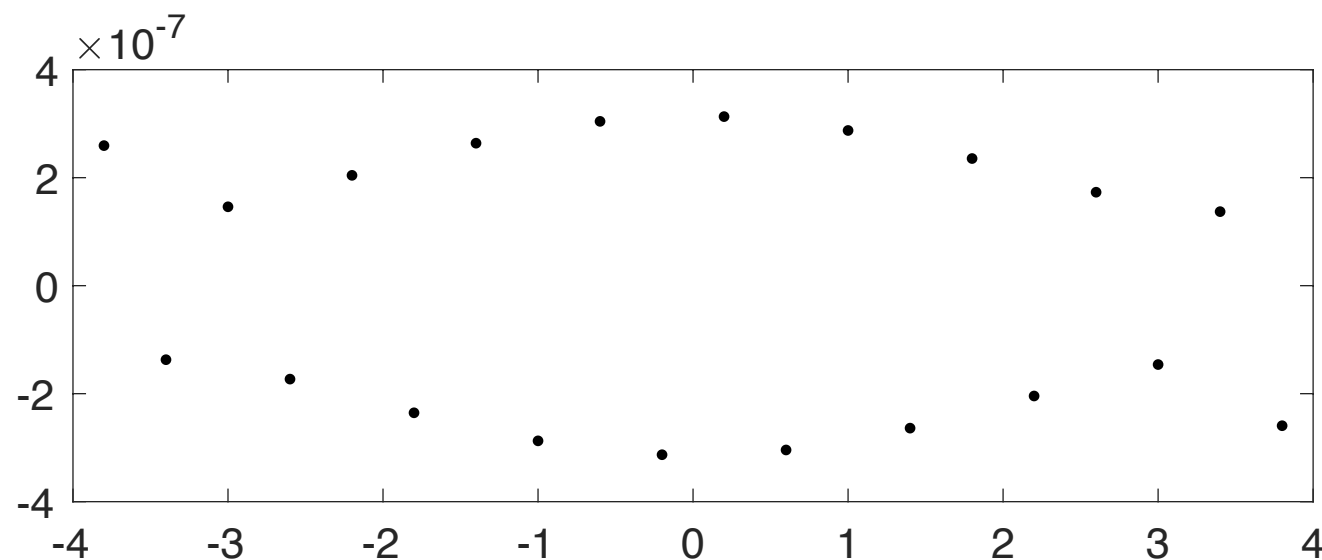
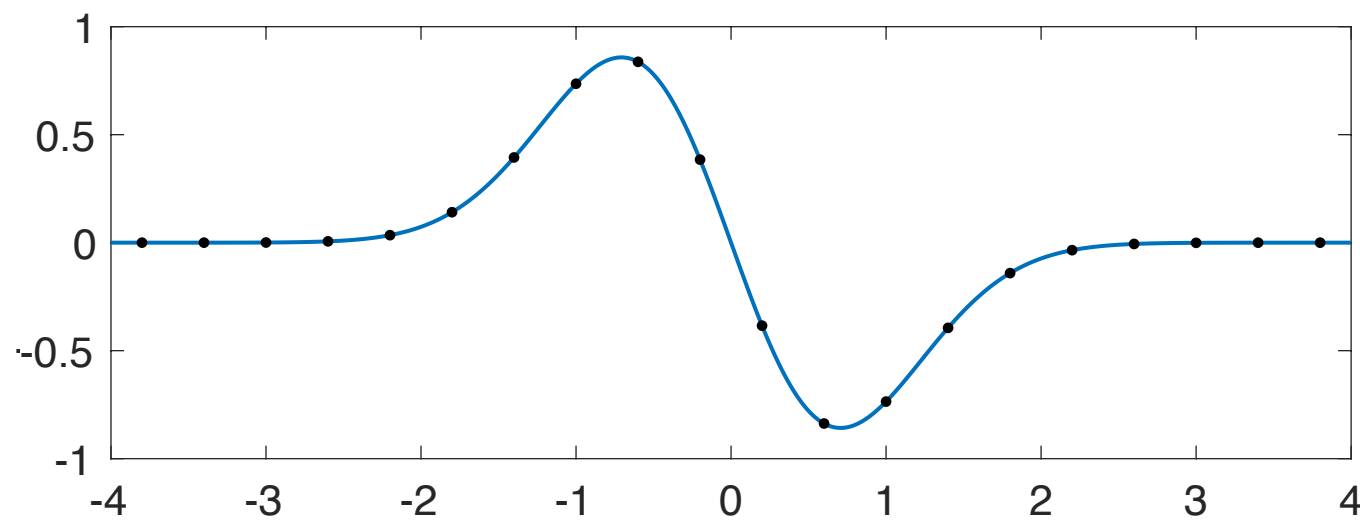
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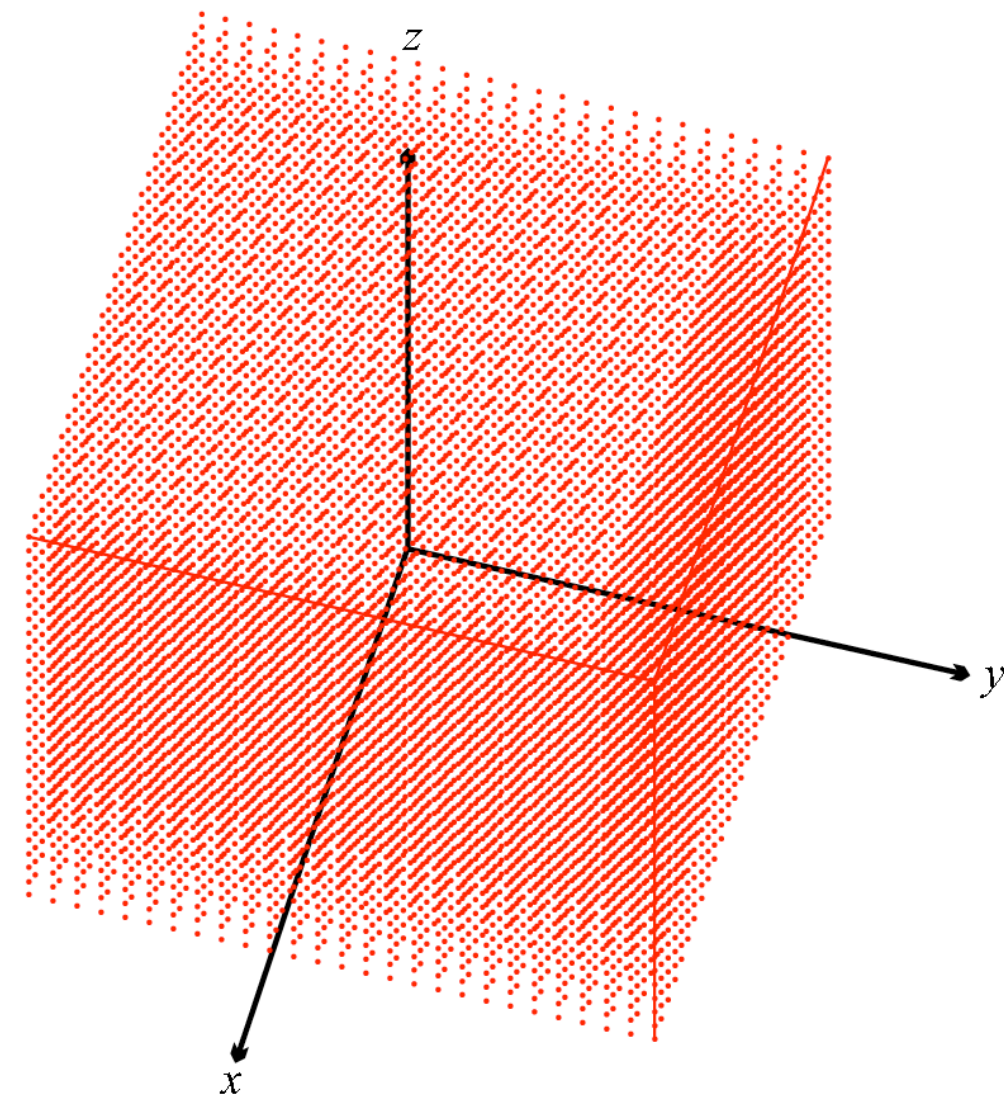
Spectral methods

$\psi_c(x)$ quadrature grid representation of field

1000×1000×1000

Vs

100×100×100



Spectral methods

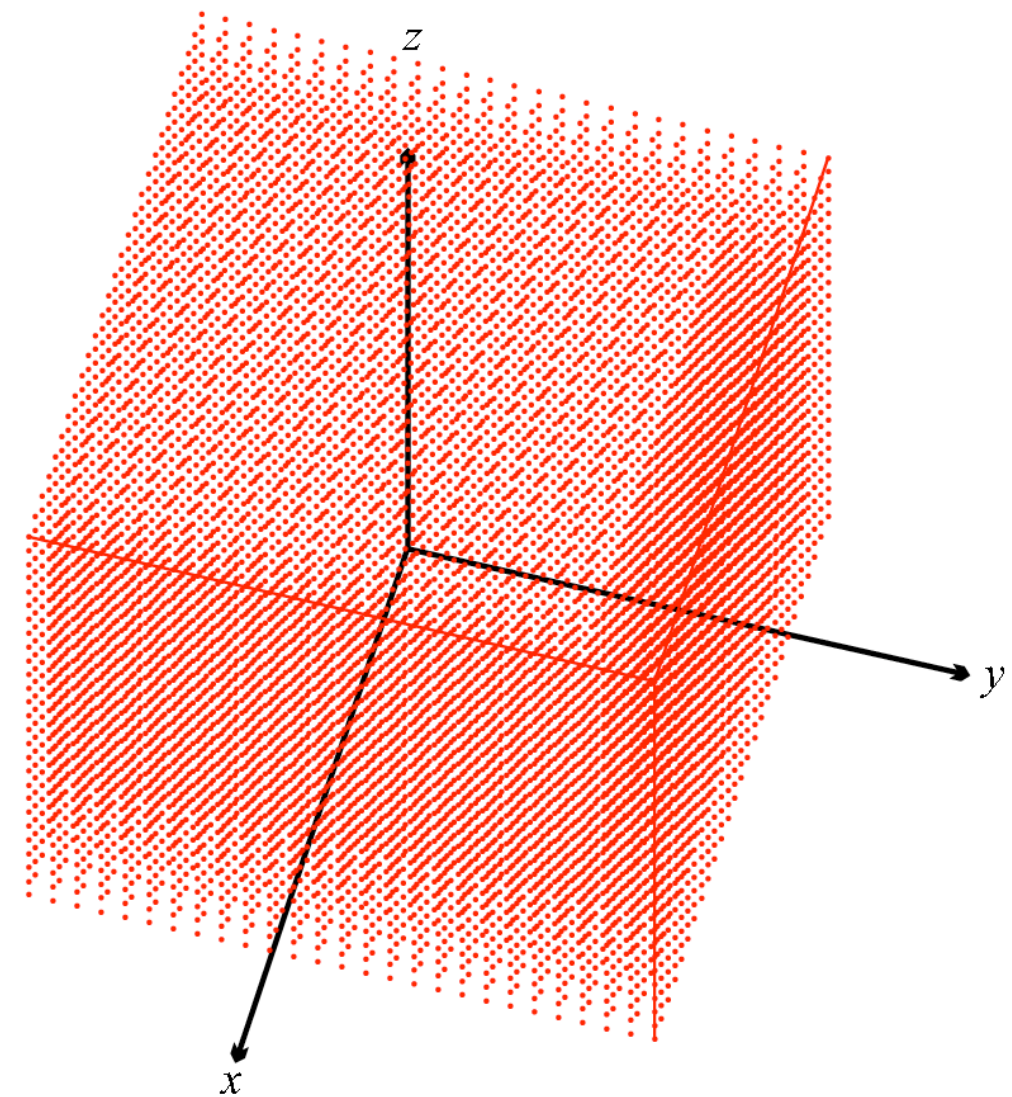
- Extremely efficient and accurate representations

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Spectral methods

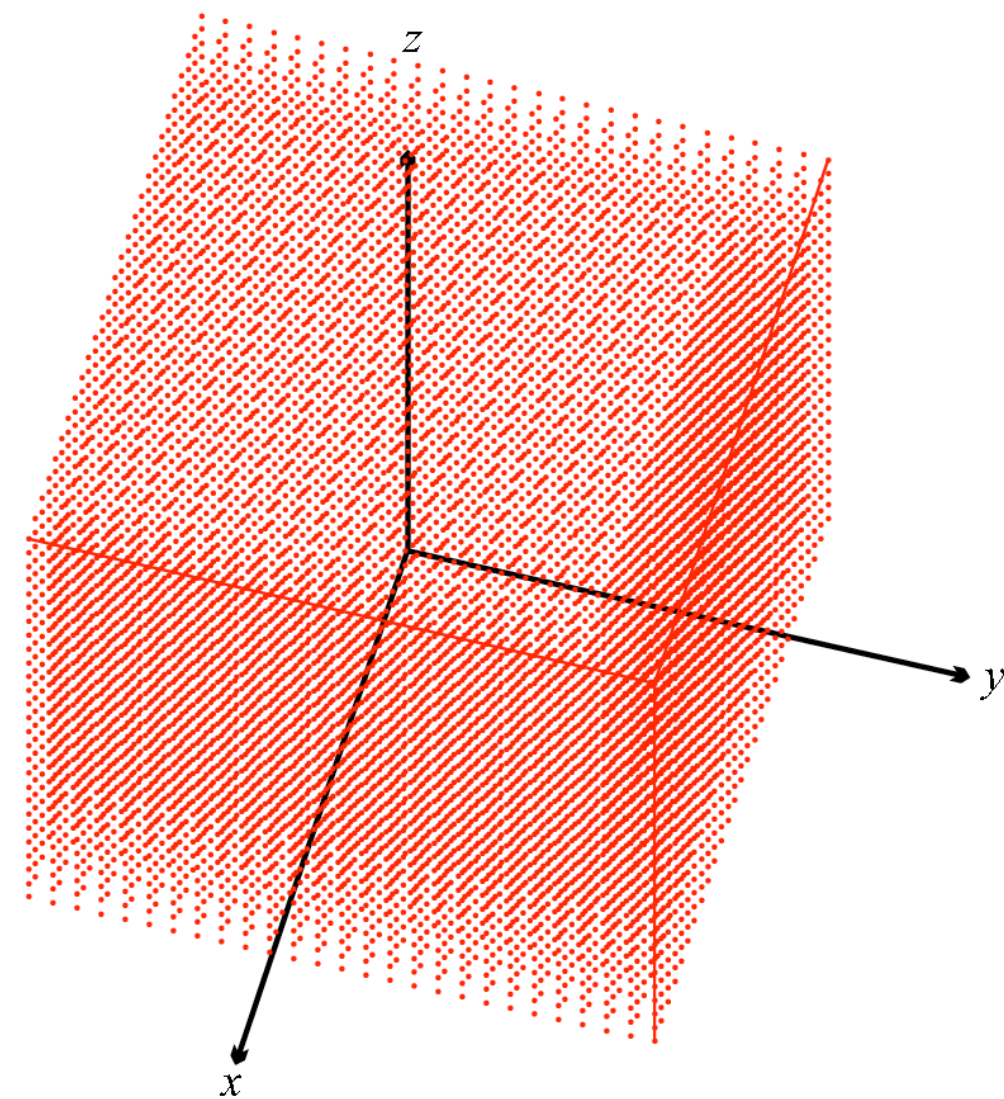
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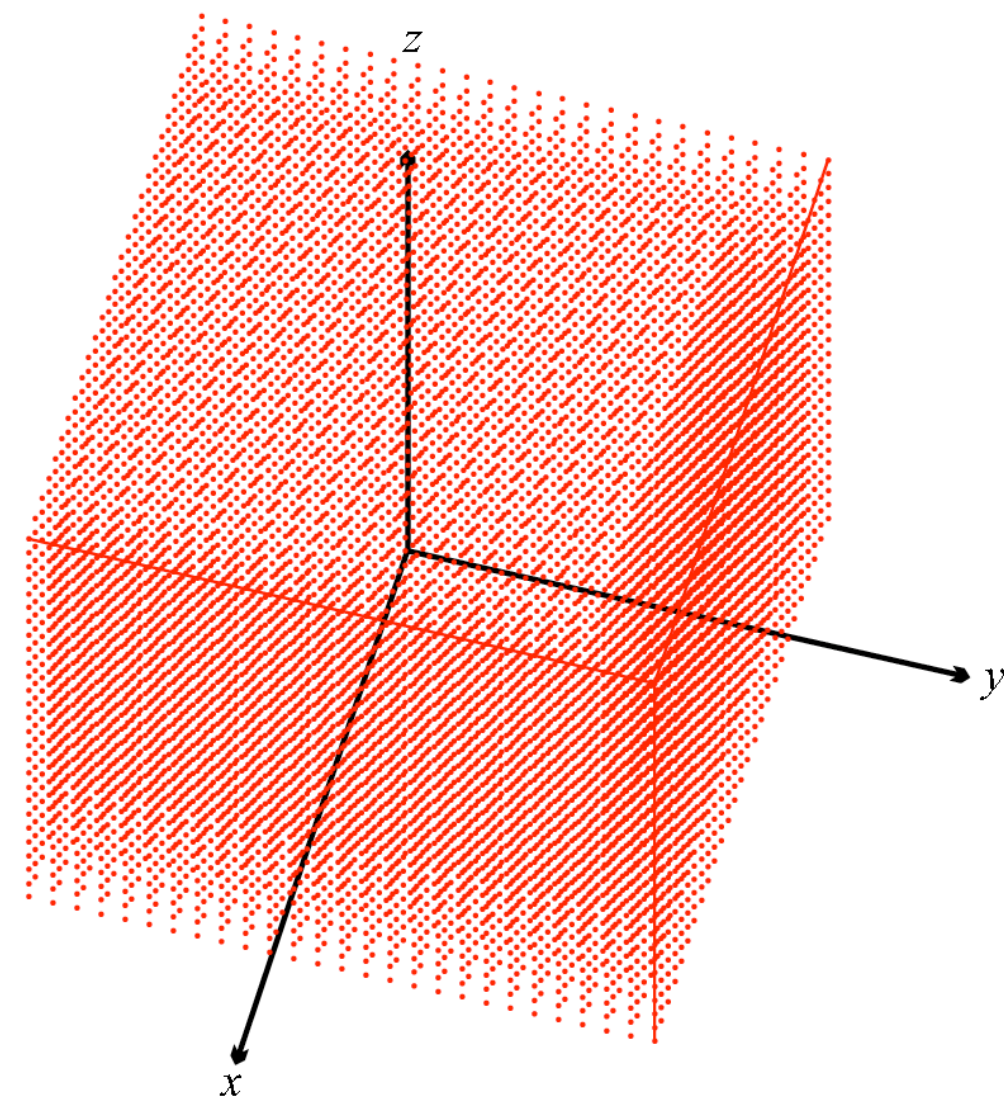
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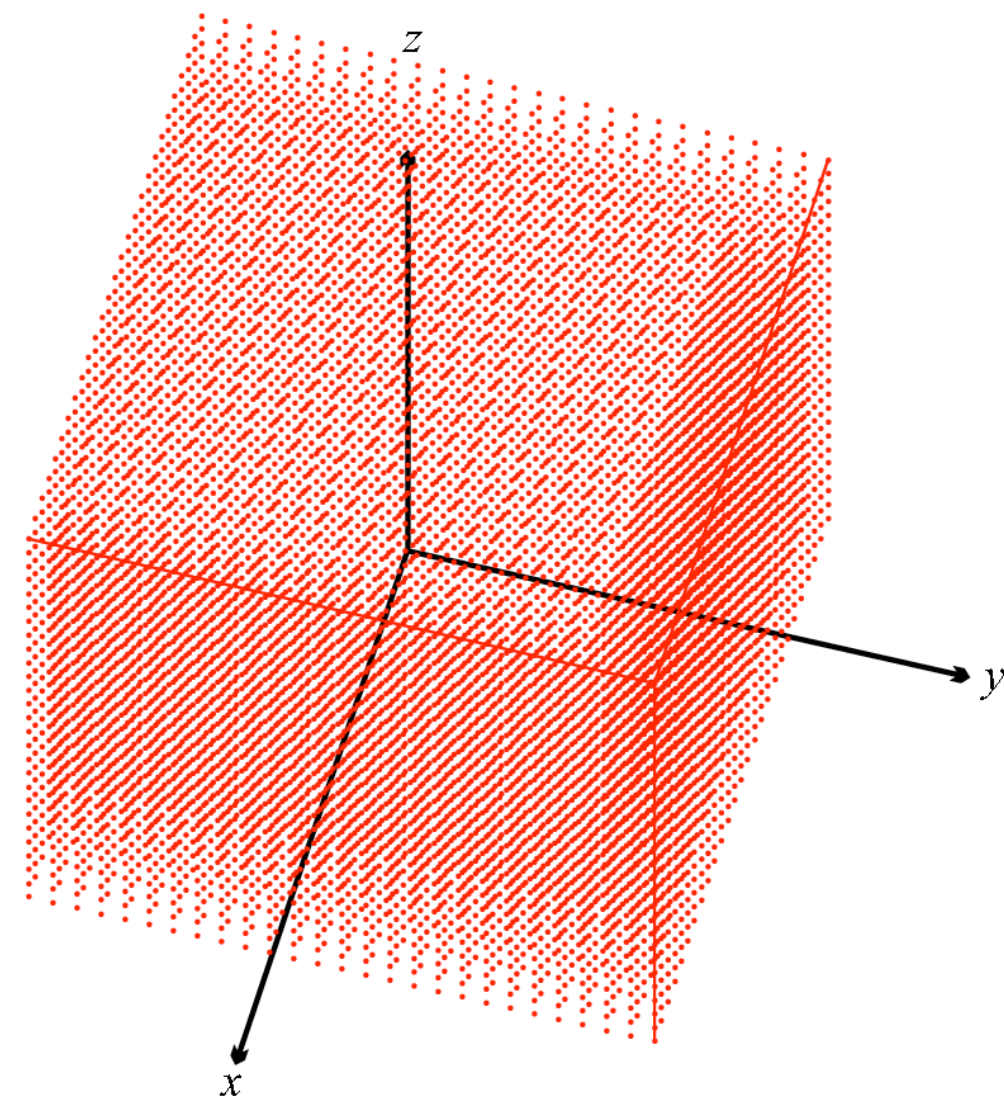
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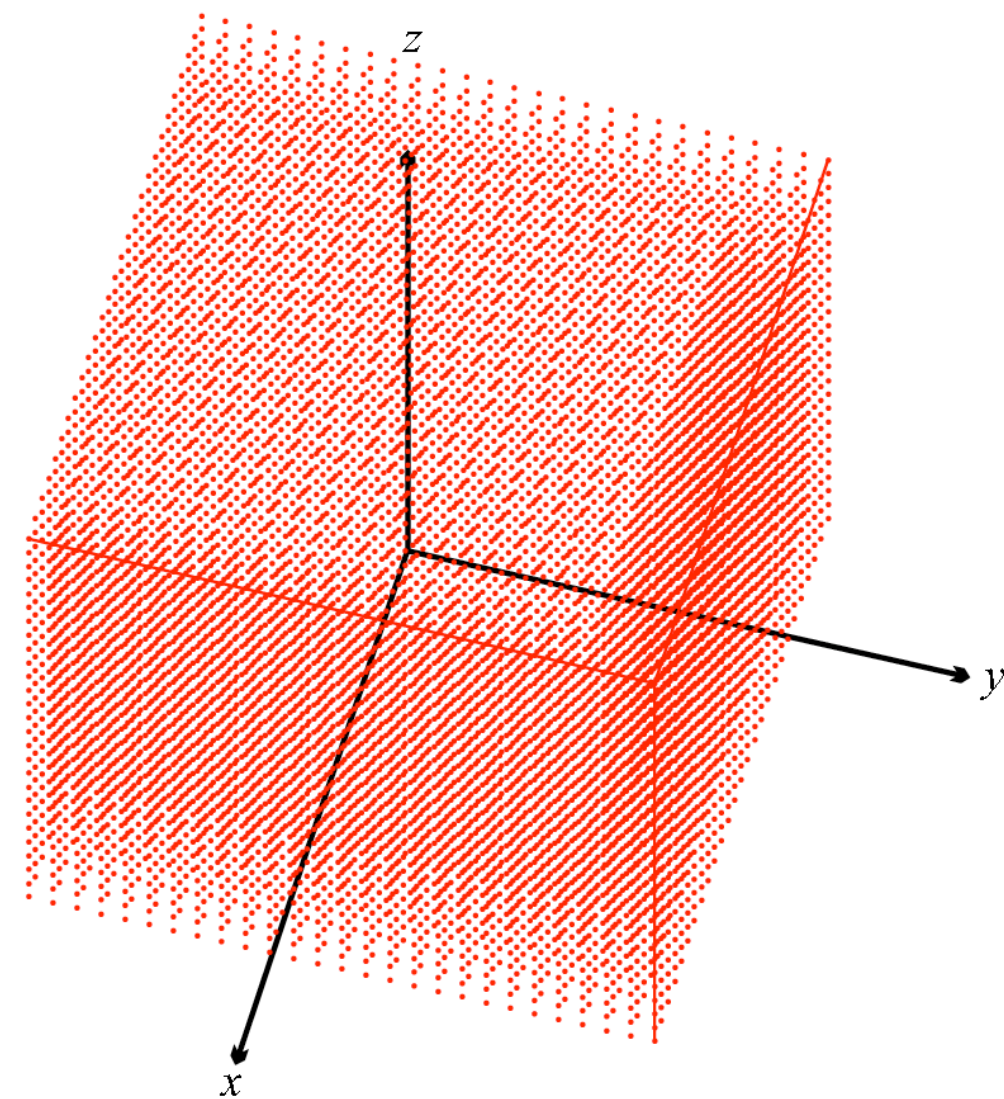
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$\psi_c(x)$ quadrature grid representation of field



Key to accurate answers (e.g. >5SF) and tractable calculations in 3D

Code

- Group members write bespoke code for their research projects.
- Most code written in MatLab
 - Good for development and execution in single node environments
 - Surprisingly (?) good performance on GPUs
 - Supported on NeSI via Otago Site licence

Hardware Performance*

		Time (s)
Mahuika	Tesla P100 GPU	25
	CPU 12 Cores	230
	CPU 24 Cores	165
	CPU 36 Cores	154
iMac Pro	CPU 8 Cores	180
Thunderbirds (Otago Cluster)	3.3GHz CPU 10 Cores	181
	2.7GHz CPU 6 Cores	195
	Titan Black GPU	35
	Titan V GPU	13

Titan V
Volta architecture
12GB HBM2
5120 CUDA cores
~\$3k USD

***Tentative numbers from a test**

3D GPE evolution 192×192×192 size



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10x

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Conclusion

- Quantum physics research is a niche user of HPC resources in NZ
- Our students are in demand in “big data” for their modelling, visualization, analysis and coding expertise.
- MORE GPUs!!!!!!

