

# COSMOLOGICAL SIMULATIONS OF STRUCTURE FORMATION WITH **FUZZY DARK MATTER**

Simon May

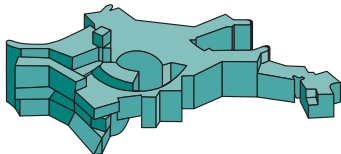
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21st September 2020



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# Outline

## Introduction

- ▶ Motivation and theoretical background
- ▶ The fuzzy dark matter equations
- ▶ Impact of fuzzy dark matter on structure formation
  - #1: Initial conditions
  - #2: Dynamics/structure
  - #3: Dynamics/objects

## Numerical methods and challenges

- ▶ Solution methods for the fuzzy dark matter equations
- ▶ Computational cost
- ▶ Resolution effects

## Simulations and results

- ▶ Dark matter power spectrum
- ▶ Halo mass function
- ▶ Dark matter halo profiles

## Summary

# What is “fuzzy dark matter”?

- ▶ F(C)DM, BECDM, ULDM, ELBDM,  $\psi$ DM, quantum-wave DM, (ultra-light) axion(-like) DM (ULA, ALP)...
- ▶ New **extremely light scalar** particle ( $m \approx 10^{-22}$  eV!)
  - electron: 511 keV
- ▶ Non-thermal production mechanism (thus not ultra-hot)
- ▶ Aggregations of bosons can form a **Bose–Einstein condensate**
- ▶ Tiny mass
  - ⇒ large de Broglie wavelength ( $\lambda \sim 1/m$ )
  - ⇒ **macroscopic quantum effects** on kpc scales
  - ▶ Structures resist collapse below quantum wavelength (**Heisenberg uncertainty principle**)
- ▶ **Large scales: equivalent to cold dark matter**

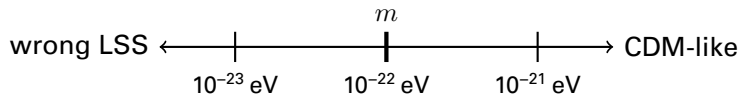
## Motivation for fuzzy dark matter

### Particle physics perspective:

- ▶ Original concept – strong CP problem:  
Why doesn't QCD violate CP symmetry?
- ▶ Solved by Peccei–Quinn U(1) symmetry and (pseudo-)scalar field (*axion!*)  
Peccei and Quinn (1977)!
- ▶ Fuzzy dark matter is **not** the QCD axion, but axion-like particles are a common feature of early-universe theories

### Astrophysics perspective:

- ▶ Small-scale challenges (cusp–core, missing satellites, ...)
- Ultra-light scalars: WIMP alternative, could improve this



- ▶ **No sign of (WIMP) CDM**

# Motivation for fuzzy dark matter

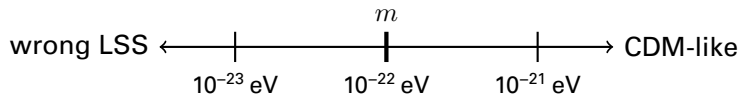
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# Derivation of the fuzzy dark matter equations

## Schrödinger–Poisson system

- ▶ Add a scalar field to the Einstein–Hilbert action of general relativity

$$S = \frac{1}{\hbar c^2} \int d^4x \sqrt{-g} \left( \frac{1}{2} g^{\mu\nu} (\partial_\mu \phi) (\partial_\nu \phi) - \frac{1}{2} \frac{m^2 c^2}{\hbar^2} \phi^2 - \frac{\lambda}{\hbar^2 c^2} \phi^4 \right)$$

- ▶ *Superfluid DM* without self-interaction ( $\lambda = 0$  or  $T \rightarrow 0$ )
- ▶ *QCD axion* case: originates from periodic potential  
 $V(\phi) \sim \Lambda^4 (1 - \cos(\phi/f_a))$  for  $\phi \ll f_a$

- ▶ Rewrite

$$\phi = \sqrt{\frac{\hbar^3 c}{2m}} \frac{1}{2} \operatorname{Re}(\psi e^{-ic^2/\hbar mt}) = \sqrt{\frac{\hbar^3 c}{2m}} (\psi e^{-ic^2/\hbar mt} + \psi^* e^{ic^2/\hbar mt})$$

and take non-relativistic limit with perturbed FRW metric

$$ds^2 = \left(1 + \frac{2\Phi}{c^2}\right) c^2 dt^2 - a(t)^2 \left(1 - \frac{2\Phi}{c^2}\right) d\vec{x}^2$$

- ▶ Result: Schrödinger equation

$$i\hbar \left( \partial_t \psi + \frac{3}{2} H \psi \right) = -\frac{\hbar^2}{2m} \nabla^2 \psi + m\Phi \psi$$

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# The fuzzy dark matter equations

## Schrödinger–Poisson system

- ▶ Schrödinger equation:

$$i\hbar\left(\partial_t\psi + \frac{3}{2}H\psi\right) = -\frac{\hbar^2}{2m}\nabla^2\psi + m\Phi\psi$$

- ▶ Mean field approximation: interpretation as **single macroscopic wave function** of Bose-Einstein condensate with density

$$\rho = m|\psi|^2$$

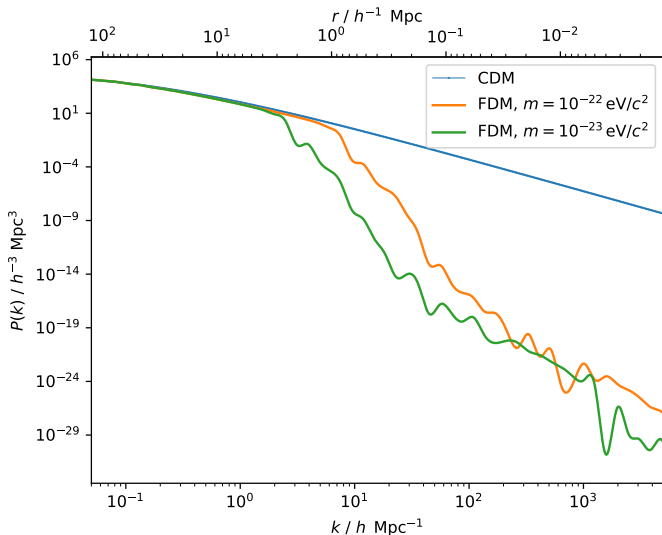
- ▶ **“FDM equations”** are the **nonlinear Schrödinger–Poisson system of equations**:

$$i\hbar\partial_t\psi_c = -\frac{\hbar^2}{2ma^2}\nabla_c^2\psi_c + \frac{m}{a}\Phi_c\psi_c$$
$$\nabla_c^2\Phi_c = 4\pi Gm(|\psi_c|^2 - \langle|\psi_c|^2\rangle)$$

Only a single scale,  
determined by  $\frac{\hbar}{m}$   
( $\rightarrow$  wavelength)

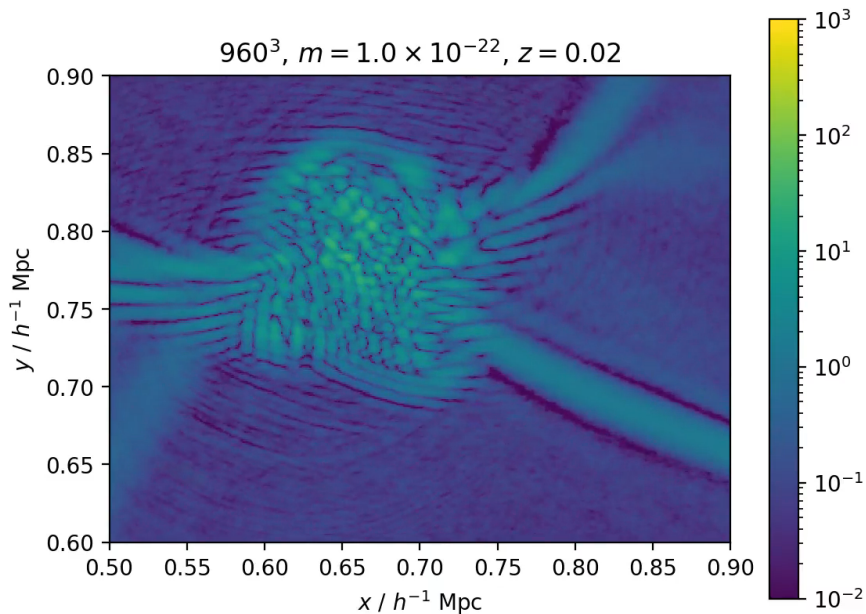


# Impact of fuzzy dark matter – #1: Initial conditions

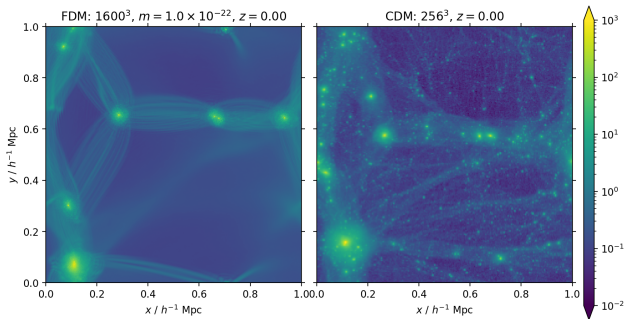


- ▶ Can be computed using AxionCAMB, Hlozek et al. (2015)
- ▶ Seeds of structure suppressed below quantum wavelength

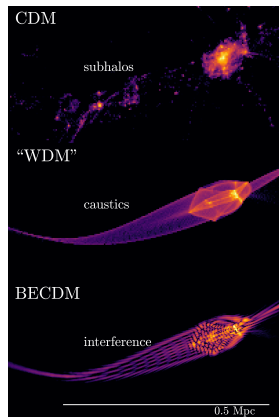
## Impact of fuzzy dark matter – #2: Dynamics/structure



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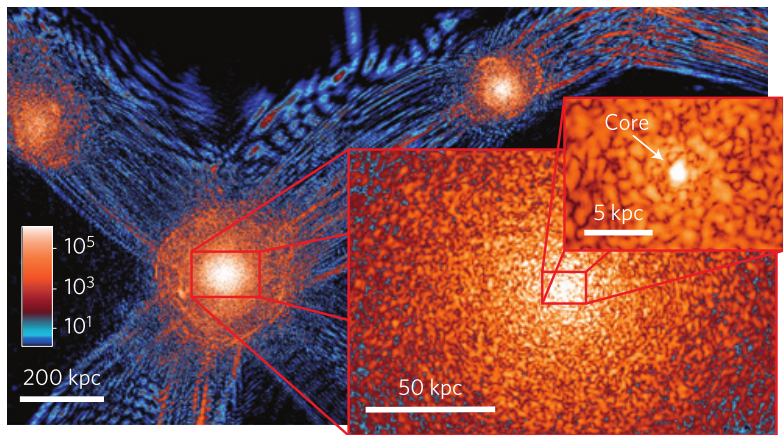


- ▶ Quantum fluctuations, interference patterns
- ▶ Small-scale (sub-)structure suppressed



Mocz, Fialkov, et al.  
(2020)

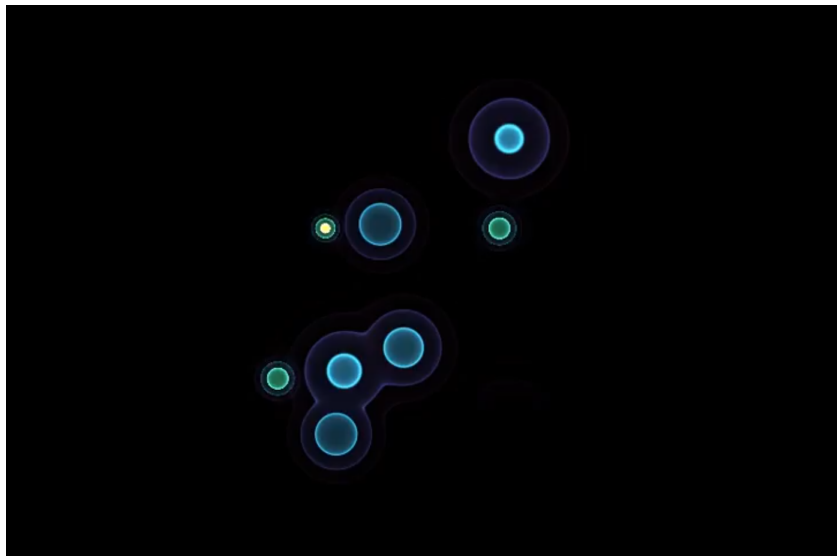
## Impact of fuzzy dark matter – #2: Dynamics/objects (solitons)



Schive, Chiueh, and Broadhurst (2014)

- ▶ Ground state of FDM equations: **soliton** (spherical “**core**”)
- ▶ Soliton(-like) cores form at the center of all virialized halos
- ▶ Fluctuations around & within soliton cores  $\Rightarrow$  **dynamical heating** (e. g. of stars)
- ▶  $M_c \sim \frac{1}{m^2 r_c} \Rightarrow$  cores are smaller for larger core or particle mass

## Impact of fuzzy dark matter – #2: Dynamics/objects (solitons)



Mocz, Vogelsberger, et al. (2017)

# Numerical approaches to fuzzy dark matter simulations

## I. Schrödinger–Poisson equations

$$i\hbar\partial_t\psi = -\frac{\hbar^2}{2ma^2}\nabla^2\psi + \frac{m}{a}\Phi\psi$$
$$\nabla^2\Phi = 4\pi Gm(|\psi|^2 - \langle|\psi|^2\rangle)$$

## II. Madelung formulation (fluid dynamics representation)

$$\partial_t\rho + \nabla \cdot \rho\vec{v} = 0$$
$$\partial_t\vec{v} + \frac{1}{a^2}(\vec{v} \cdot \nabla)\vec{v} = -\nabla \left( \frac{1}{a}\Phi - \underbrace{\frac{\hbar^2}{2m^2a^2} \frac{\nabla^2\sqrt{\rho}}{\sqrt{\rho}}}_{=Q} \right)$$
$$\nabla^2\Phi = 4\pi G(\rho - \bar{\rho})$$

$$\psi = \sqrt{\frac{\rho}{m}}e^{i\alpha}$$
$$\rho = m|\psi|^2$$
$$\vec{v} = \frac{\hbar}{m}\nabla\alpha$$

- Phase is undefined for  $\rho = 0$   
⇒ significant effects on overall evolution

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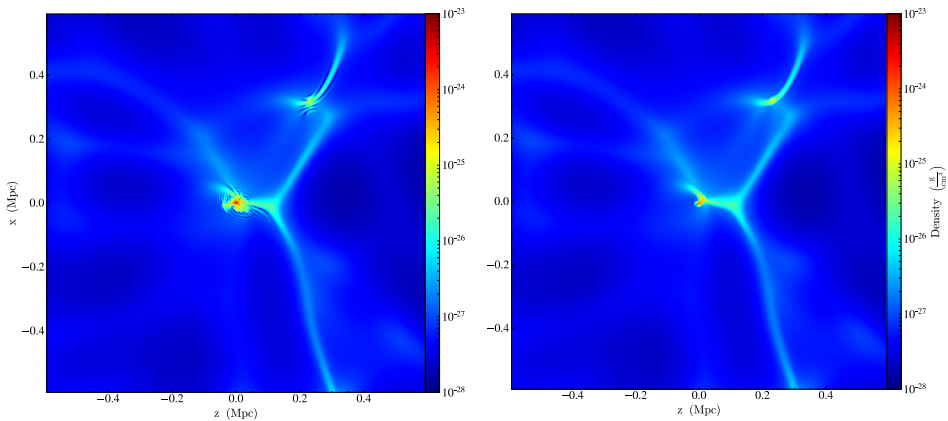
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**“quantum potential”**  
**“quantum pressure”**

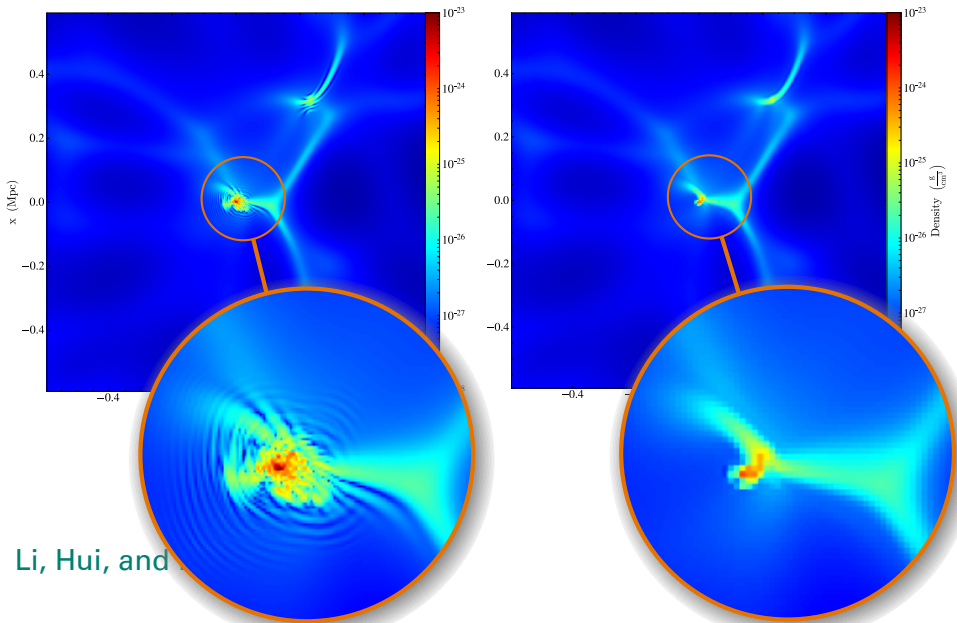
# Schrödinger–Poisson vs. Madelung formulation



Li, Hui, and Bryan (2018)



# Schrödinger–Poisson vs. Madelung formulation



Li, Hui, and

# Using pseudo-spectral methods to simulate fuzzy dark matter

- ▶ Symmetrized split-step Fourier method (“kick–drift–kick”)
- ▶ Algorithm:

$$i\hbar\partial_t\psi = -\frac{\hbar^2}{2ma^2}\nabla^2\psi + \frac{m}{a}\Phi\psi$$
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$\psi \leftarrow e^{-i\frac{m}{\hbar}\frac{\Delta t}{2}\Phi}\psi$	kick
$\psi \leftarrow \text{IFFT}\left(e^{-i\frac{\hbar}{m}\frac{\Delta t}{2}k^2}\text{FFT}(\psi)\right)$	drift
$\Phi \leftarrow \text{IFFT}\left(-\frac{1}{k^2}\text{FFT}(4\pi Gm( \psi ^2 - \langle \psi ^2\rangle))\right)$	update potential
$\psi \leftarrow e^{-i\frac{m}{\hbar}\frac{\Delta t}{2}\Phi}\psi$	kick

Choice of time step:  $\Delta t < \min\left(\frac{4}{9\pi}\frac{m}{\hbar}a^2\Delta x^2, 2\pi\frac{\hbar}{m}a\frac{1}{|\Phi_{\max}|}\right)$

- ▶ “Exact” solution
- ▶ Automatic conservation of mass
- ▶ Can adapt existing particle–mesh (PM) code
- ▶ Simple implementation

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## Correspondence of CDM and FDM initial conditions

- ▶ Cold dark matter (CDM): Collisionless fluid, described by a phase space distribution function  $f(\vec{x}, \vec{v})$
- ▶ Can construct a wave function  $\psi$  from a distribution function  $f$ :

$$\psi(\vec{x}) \sim \sum_{\vec{v}} \sqrt{f(\vec{x}, \vec{v})} e^{im/\hbar \vec{x} \cdot \vec{v} + R_{\vec{v}}}$$

For “cold”/single-stream distribution function:

$$\psi = \sqrt{\frac{\rho}{m}} e^{i\alpha}$$
$$\vec{v} = \frac{\hbar}{m} \nabla \alpha$$

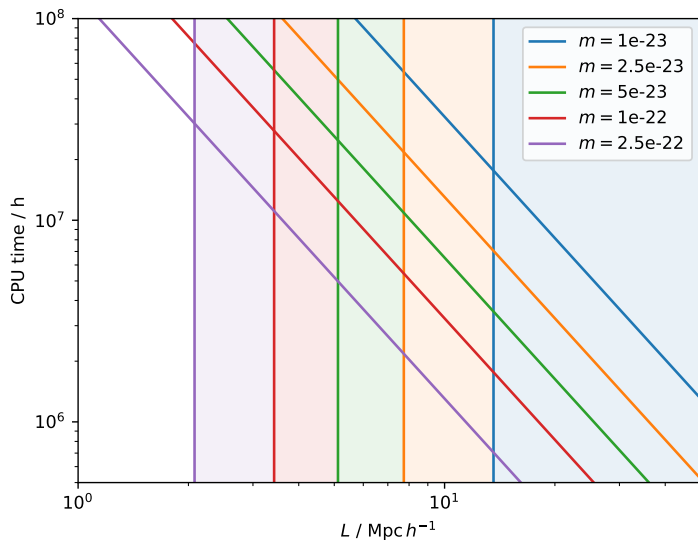
- ▶ Grid discretization implies a maximum velocity which can be represented

Mocz, Lancaster, et al. (2018), Mocz, Fialkov, et al. (2020)

$$v < \frac{\hbar}{m} \frac{\pi}{\Delta x}$$

# Computational cost of fuzzy dark matter simulations

Computational cost scales as  $\sim m^{-1}$  with mass,  $\sim L^{-2}$  with box size &  $\sim N^5$  with grid size!



8192<sup>3</sup> grid

$10^7$  CPU h  $\triangleq$   
two full months  
of entire MPA  
cluster (FREYA)!

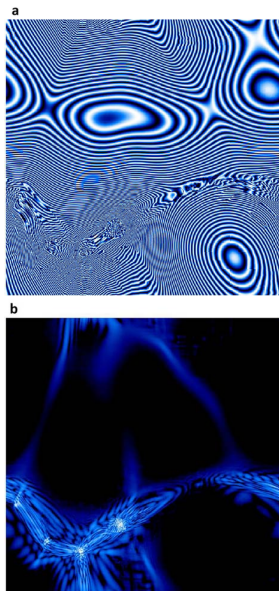
$$\Delta t < \frac{4}{9\pi} \frac{m}{\hbar} a^2 \Delta x^2$$
$$v < \frac{\hbar}{m} \frac{\pi}{\Delta x}$$

# Why is it hard to simulate fuzzy dark matter?

## Computational challenges

- ▶ **Both** large scales and small (kpc-scale) de Broglie wavelength must be resolved for correct evolution
- ▶ High velocities require high resolution even in low-density regions  
**Velocity criterion:**  $v < \frac{\hbar}{m} \frac{\pi}{\Delta x}$
- ▶ **Time step criterion:**  $\Delta t \sim \Delta x^2$   
(seems to be approach-independent)
- ▶ (Tooling: Hydrodynamics codes are designed for  $N$ -body simulations)

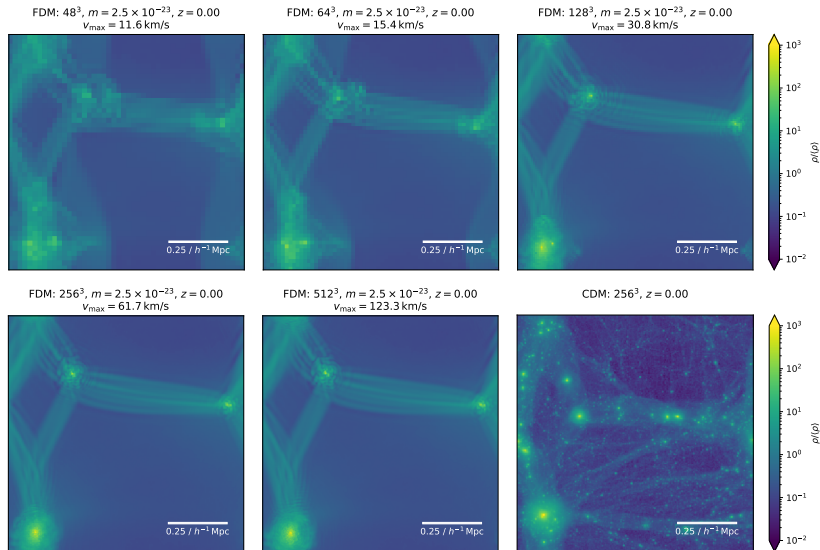
Schive, Chiueh, and Broadhurst (2014)



# Resolution effects

## Impact of lacking resolution

1 Mpc box projections; 99th-percentile velocity in the CDM simulation is 97.2 km/s

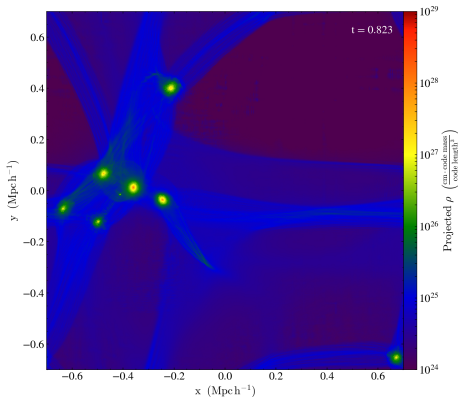


Not immediately obvious that something went wrong!

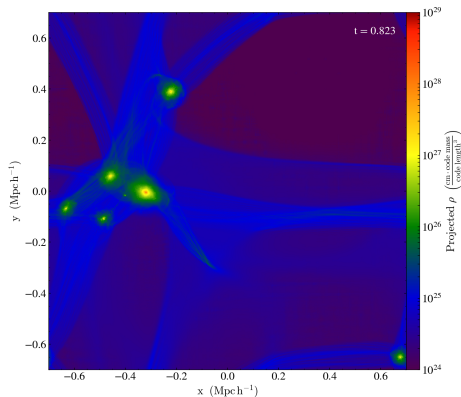
# Resolution effects

## Halo formation

### Lower resolution



### Higher resolution



Evolution is delayed/halted for simulations with insufficient resolution

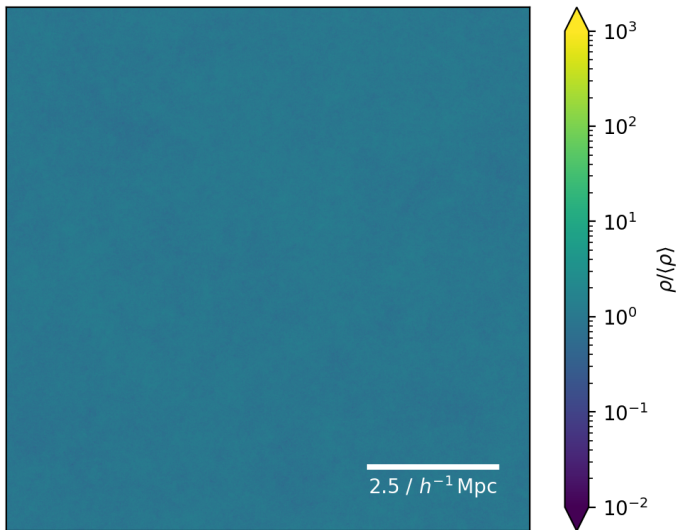
(images from Schive, FDM Workshop Göttingen 2020)



# Largest cosmological FDM simulation so far

$8640^3$  grid,  $10 \text{ Mpc}/h$  box,  $m = 10^{-22} \text{ eV}$  (slices through simulation volume)

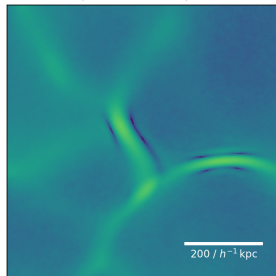
$8640^3$ ,  $m = 1.0 \times 10^{-22}$ ,  $z = 127.00$



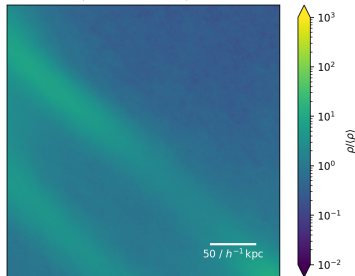
May et al., in prep.

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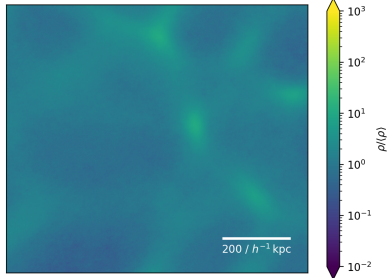
$8640^3$ ,  $m = 1.0 \times 10^{-22}$ ,  $z = 8.96$



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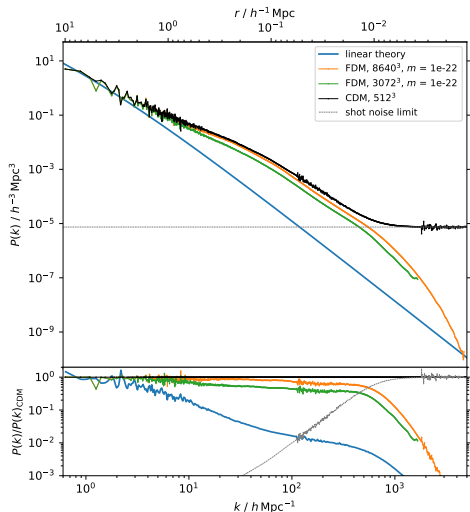
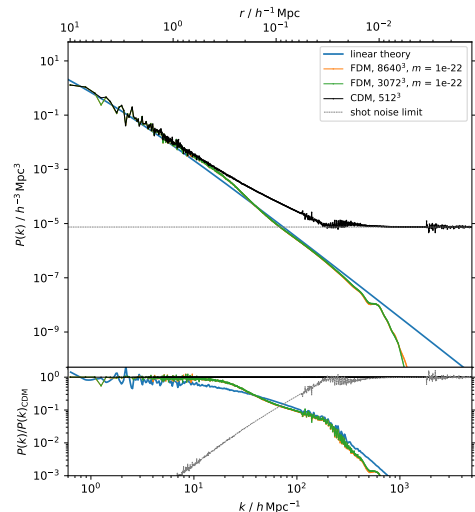


# First results: Dark matter power spectrum

10 Mpc/h box simulations

$z = 15.00$

$z = 7.00$

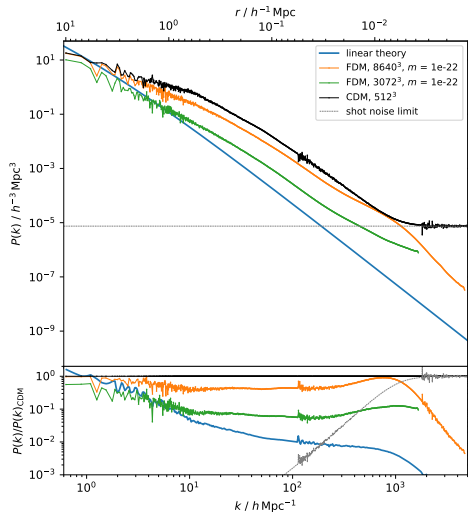


May et al., in prep.

# First results: Dark matter power spectrum

$10 \text{ Mpc}/h$  box simulations

$z = 3.00$

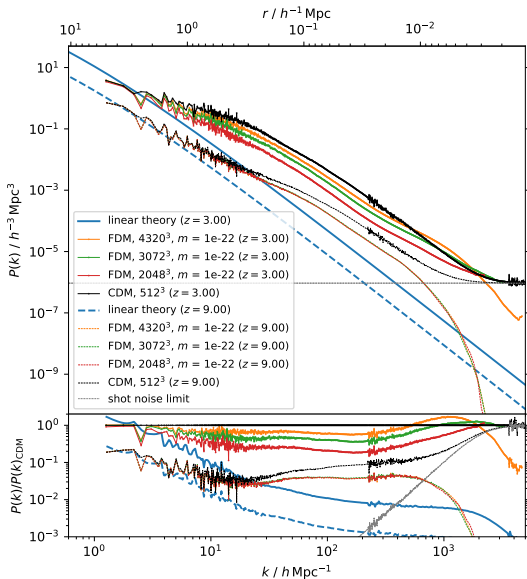


- ▶ Agreement on large scales
- ▶ Delayed structure formation
- ▶ Suppression on small scales
- ▶ Insufficient resolution causes structure to “freeze” below a certain redshift

May et al., in prep.

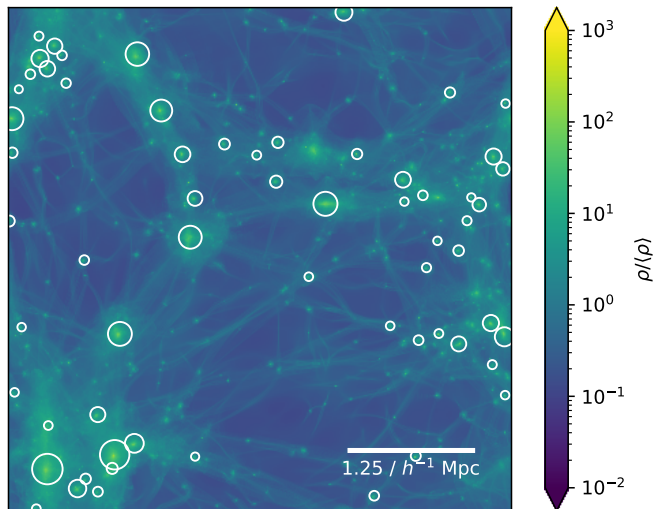
# First results: Dark matter power spectrum

5 Mpc/h box simulations



May et al., in prep.

## Finding halos

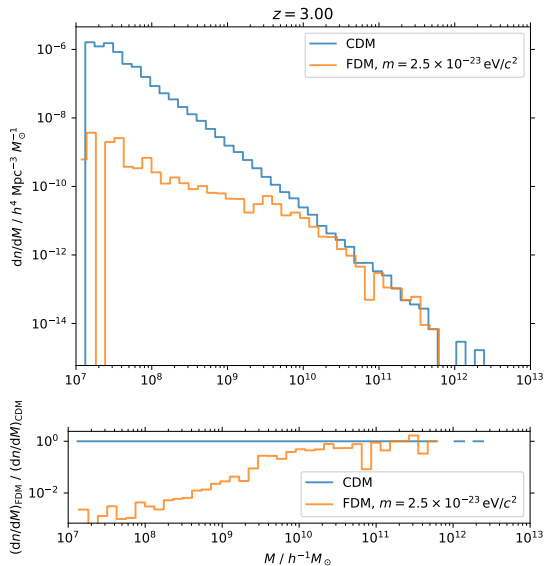


May et al., in prep.

Developed modified friends-of-friends halo finder to operate on a Cartesian grid

# First results: Halo mass function

$10 \text{ Mpc}/h$  box simulations



- ▶ Fewer low-mass objects
- ▶ Similar counts for the largest halos

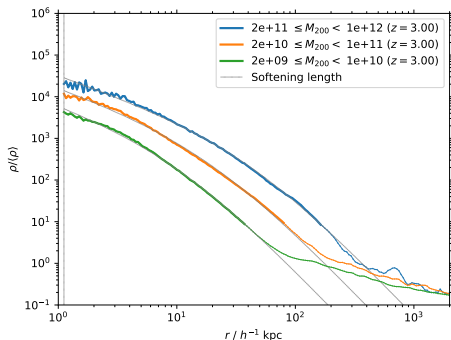
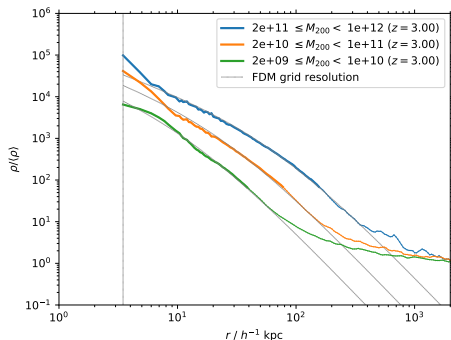
May et al., in prep.

# First results: Dark matter halo profiles (stacked)

$10 \text{ Mpc}/h$  box simulations

FDM ( $m = 2.5 \times 10^{-23} \text{ eV}/c^2$ )

CDM



- ▶ Fuzzy dark matter halos form central cores with flat density profiles
- ▶ Adaptive resolution better suited to show inner halos

May et al., in prep.



## Summary

Main problems for fuzzy dark matter simulations:

1. **Time integration**  $\Delta t \sim \Delta x^2$
2. **Rapid oscillations** even in low-density regions
3. **Large dynamic range**: “large”-scale structure simulations must still resolve de Broglie wavelength, limited to  $\lesssim 10 \text{ Mpc}/h$  box
4. “New” field without decades of experience or refined codes/methods as for CDM

Features of FDM dynamics compared to CDM:

1. Modified **initial power spectrum**, small scales suppressed
2. **Suppression** of structure below de Broglie wavelength ( $\approx \text{kpc}$ )  
→ Heisenberg uncertainty principle
3. Formation of **halo cores**
4. Fluctuating  $\approx \text{kpc}$  quantum **interference patterns**

# References

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