# Measuring excess energy from galaxy feedback with mathematical modelling in R

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2012 useR! conference

Introduction	Astrophysical context	Mathematical model	Gas cooling	Summary
Outline				



- Astrophysical context
- 3 Mathematical model
- Gas cooling



- Astrophysical context
  - energy input from cosmic feedback (black holes, supernovae)
- Mathematical model
  - solving T(r) &  $\rho(r)$  structure of hot gas in clusters of galaxies
- Gas cooling
  - exploring the energy impact of gas loss via cooling
- Summary



- Mathematical model construction via solution of (coupled) differential equation(s): deSolve package
- Multiple evaluation and capture of results over a grid of models: plyr package
- Visualization of structured data: ggplot2 package
- Good demonstration of R's powerful capabilities in easily combining numerical analysis with structured data handling and visualization
  - ullet ightarrow rapid prototyping pipeline

- 2 Astrophysical context
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#### Gas cooling



# Clusters of galaxies

• Clusters of galaxies are the largest gravitationally bound objects in the Universe; 1–2 Mpc radius ( $\sim 5 \times 10^{22}$ m):

#### Typical mass composition

- ho  $\sim$  82% dark matter
- ~ 15% hot gas (~  $10^{7-8}$  K,  $\rho \sim 10^{-3}$  cm<sup>-3</sup>)  $\rightarrow$  emits X-rays (shown in blue)
- $\sim$  3% stars (mostly in the galaxies)

#### Abell 1689 galaxy cluster



## Cosmic feedback



- The Universe expands & cools → stars form and material pulled into super-massive black holes at the centre of galaxies
  - triggers black hole outbursts (left) and supernova explosions (right) → inject energy into the surrounding gas
  - cooling is (partially) regulated in a *negative feedback cycle*

 $\rightarrow$  the details of this feedback cycle are poorly understood

## Hot gas in galaxy clusters

- Hot gas accounts for majority of normal matter ('baryons') in galaxy clusters
  - retains record of past feedback (non-gravitational heating) in its temperature and density structure
  - gas temperature and density structure can be mapped from its X-ray emission (e.g. Sanderson & Ponman, 2010)
- The gas is approximately in **hydrostatic equilibrium** in the gravitational potential
  - when fluid pressure balances gravity, e.g. within a stable star

## Hydrostatic equilibrium

• Thermal pressure balances gravity:

$$rac{dP_{ ext{gas}}}{dr} = -rac{GM_{ ext{total}}(< r)}{r^2}\,
ho_{ ext{gas}}$$

$$P = \rho_{\rm gas} k_B T$$

- $\Rightarrow$  can recast in terms of  $\frac{dT}{dr}$  and  $\frac{d\rho_{\rm gas}}{dr}$
- Ignore self-gravity of gas; dark matter dominates total mass
- Can solve this differential equation using the *ode* function in the deSolve R package

# Binding energy & excess energy

 Binding energy is simply the energy needed to 'unbind' a gas particle (i.e. move it an infinite distance away):

 $BE = gravitational \ energy - thermal \ energy$ 

- Any extra energy, injected by cosmic feedback would *lower* BE, by reducing the extra energy needed for unbinding
- But. . . need a suitable baseline reference model for comparison
  - must compare observed & baseline model BE within the same enclosed gas mass (not radius!)

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# Simple, self-similar model

- Gravity is a scale-free force: big things should resemble scaled up versions of small things → self-similarity
- But, 'baryon' physics (i.e. cosmic feedback) breaks symmetry: introduces characteristic scale(s); *smaller things affected more*
- The self-similar baseline model assumes that gas traces mass: i.e. constant gas fraction

$$f_{gas} = \frac{M_{\rm gas}(< r)}{M_{\rm total}(< r)} = 0.13$$

• 0.13 is roughly 90% of the gas fraction of the whole Universe

### Thermodynamic structure of self-similar model

Need to re-arrange a mass of gas  $(M_{\rm gas})$  in the same gravitational potential, with a constant gas fraction,  $f_{\rm gas}=13\%$ 

$$M_{
m gas} = f_{
m gas} imes M_{
m tot}$$

$$ho_{
m gas}(r) = f_{
m gas} imes 
ho_{
m total}(r)$$

Assume an **outer** boundary condition of  $\frac{dlnK}{dlnr} = 1.1$ , motivated by theoretical models of galaxy cluster formation (e.g. Tozzi & Norman, 2001)

$$\text{'entropy'}, \ \mathcal{K} = \frac{k_B T}{\rho_{\text{gas}}^{\frac{2}{3}}}$$

## Self-similar vs. observed model



ullet Observed model gas is hotter & less dense ightarrow higher entropy

## Spatial variation in excess energy



- Radius increases to the right; 1 curve per cluster; self-similar ref. model
- Suggests a centrally concentrated heating source

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# Cooling vs. heating

- $\bullet\,$  Gas cools & condenses to (mostly) form stars
  - confined to inner regions, where gas entropy is lowest
  - gas flows in from larger radii to replace it
- Self-similar model ignores cooling: will overestimate the observed excess energy
- Model generalized to allow loss of gas due to cooling
  - gas mass distribution is 'truncated' by a given amount
  - remaining gas rearranged in hydrostatic equilibrium

## Truncated gas mass model

- Convective stability ⇒ entropy is monotone function of radius
   K(M<sub>gas</sub>) fully specifies gas in hydrostatic equilibrium, for a given gravitational potential
- Truncate K(M<sub>gas</sub>) by some mass of gas (assumed cooled out)
   → defines new central entropy level: inner boundary condition
   truncated gas mass redistributed within the same potential
- Solve coupled differential equations (Voit et al., 2002):

$$\frac{dP_{\rm gas}}{dr} = -\frac{GM_{\rm total}(< r)}{r^2} \rho_{\rm gas}$$
(1)

$$\frac{dM_{\rm gas}}{dr} = 4\pi r^2 \,\rho_{\rm gas} \tag{2}$$

Summary

## Cooling (truncated) vs. self-similar model



 Lowest entropy gas is removed (would form stars); remaining gas rearranged in hydrostatic equilibrium: ends up hotter → mimics heating

# Effect of cooling on binding energy

- Entropy is a monotone function of radius  $\Rightarrow$  cooling (truncation) removes the most tightly bound gas
  - binding energy of remaining gas is lower

Gas mass truncated (Solar)	Excess energy (keV/particle)
- (Self-similar)	1.96
1e10	1.96
1e11	1.92
5e12	1.05

- Excess binding energy of this observed galaxy cluster vs. truncation of 5  $\times$   $10^{12}$  Solar masses is almost halved
  - 'correct' truncation level needs to be based on the stellar mass within each cluster  $\rightarrow$  future work

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- Measured mean **excess** binding energy of gas in galaxy clusters compared to baseline 'Self similar' model & explored effect of cooling, by solving (coupled) differential equation(s)
- Initial results favour centrally concentrated heating source: Active Galactic Nucleus (AGN) in central brightest galaxy, powered by super-massive black hole ( $\sim 10^9$  Solar mass)
- Further development of the model needed to understand the impact of both cooling and the epoch of heating
- *R* enables smooth integration of mathematical modelling with structured data manipulation and visualization: deSolve, plyr & ggplot2 packages

### Contact details

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#### Birmingham R User Meeting (BRUM) (co-organizer)



www.birminghamR.org

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These slides were written as a beamer presentation in (Emacs) org mode



Image credits

- Abell 1689 galaxy cluster (X-ray: NASA/CXC/MIT/E.-H Peng et al; Optical: NASA/STScl)
- Centaurus A galaxy (X-ray: NASA/CXC/CfA/R.Kraft et al.; Submillimeter: MPIfR/ESO/APEX/A.Weiss et al.; Optical: ESO/WFI)
- M82 galaxy (X-ray: NASA/CXC/JHU/D.Strickland; Optical: NASA/ESA/STScI/AURA/The Hubble Heritage Team; IR: NASA/JPL-Caltech/Univ. of AZ/C. Engelbracht)

References

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