40 kpc

A M31/MW analog in TNG50 (movie credits: D. Nelson, MPA)

z=1.3

Milky-Way Analogues with Cosmological Simulations: Illustris/TNG and other numerical projects

ANNALISA PILLEPICH MPIA, Heidelberg

 $\log M_{\star} = 10.12$ SFR = 7.3 M_o yr⁻¹



Milky-Way Analogues in Cosmological Simulations: Illustris/TNG and other numerical experiments





Annalisa Pillepich, Ljubljana, 2019/06/13

Rationale of this talk

How do we make MW analogues at supercomputers? How good do these analogues need to be? What can we learn from them i.e. from such numerical experiments?

How do we make MW analogues at supercomputers?

The foundations of *cosmological* simulations: the cosmological setup



Isolated/Idealized Experiments

Credits/Refs: D'Onghia, Hernquist, Hopkins, Agertz, Laporte, Khoperskov...

This talk Cosmological Simulations

Cosmological Model => Initial Conditions ICs = quasi-homogeneous and isotropic distribution of matter

~250 comoving Mpc (matter density projection)

This talk: LCDM paradigm

For MWs: Not just the main body, but also its satellites and surrounding haloes



Pillepich et al. 2008

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ViaLactea + the Aquarius Project (2008): mature realizations of MW-like haloes

Around 2008, **dark-matter only** or N-body only or gravity-only simulations of haloes like the one of the MW already reached great levels of numerical sophistication, realized in the full cosmological context



Eris (2011): the first realistic late-type simulation similar to the MW,

with DM, stars, and gas

Eris (Guedes et al. 2011) Code = Gasoline; zoom-in cosmological technique N-body + SPH DM, GAS, STAR particle mass = 1e5, 2e4, 6e3 Msun ~120pc spatial resolution

1 disk galaxy: MTot = 8e11 Msun; Mstars = 4e10 Msun

Galaxy Formation Model:

•radiative cooling of the gas (Compton, atomic, low-T Z-dependent)

- heating from cosmic UV Background
- Supernova feedback, a' la Stinson:2006 i.e. thermal feedback from SNIa and SNII
- Star Formation a' la Governato 2010:
 - threshold $n_{SF} = 5$ atoms/cm3
 - efficiency $\epsilon_{\text{SF}} = 0.1$
 - IMF: Kroupa et al. 1993
- NO AGN feedback



9

10

5

 $d \frac{6}{MW} [kpc]$

2013-2015: towards larger samples of L* galaxies with more complete physics

Projects with 1 to a few disk galaxies at 10^12 Msun haloes, with DM+GAS+STARS become "state of the art"



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The Latte Simulations (2016): more realistic treatments of SF and its feedback

FIRE-2 generation of a handful of MW-like galaxies. (Wetzel et al. 2014) Code = GIZMO (mesh-free); zoom-in 1-4 simulations (Mhalo ~1-2e12Msun)

Exquisite resolution:

- 35,000 Msun for dark-matter
- 7070 Msun for gas
- 7070 Msun *initially* for stars ([,]

m12i

With

•SF recipes beyond the density threshold •explicit stellar feedback •multi-phase ISM modeling •(no BH feedback)

See also other grid-code disk galaxy simulations by e.g. Agertz et al. 2016 Semenov et al. 2017

STELLAR LIGHT (with DUST in post processing)

The Auriga Simulations (2017): BH feedback and magnetic field realizations

AURIGA SIMULATIONS

(Grand et al. 2017) Code = AREPO zoom-in 30+ galaxies (Mhalo ~1-2e12Msun) GAS/STARS mass = ~5e4 Msun



Pakmor et al. 2013, 2014, 2017

With black hole feedback and magnetic fields! Chemical enrichment (SNIa, SNII, AGB; 11 elements)

Elvis and Apostle (2015): towards rendering the MW+M31 Local Group



See also **ELVIS on FIRE** (Garrison-Kimmer et al. in prep) with Gizmo

The APOSTLE (Sawala et al. 2015) Code = Gadget; zoom-in cosmological technique EAGLE model, i.e. DM+STARS+GAS+BHs 12 MW+M31 systems



2014 onwards: the advent of large cosmological volumes for galaxy physics

In 2014, Illustris was one of the first large cosmological volume simulation that followed the co-evolution of thousands of galaxies and was capable of reproducing the observed diversity of galaxies





Illustris, Eagle, Horizon-AGN, Massive-Black, Magneticum, Mufasa,

A few tens - 100 Mpc boxes ~1 kpc resolution Tens of housands of well resolved galaxies, including ~1e3 MW-mass central galaxies

The TNG Simulations

PI: V. Springel (MPA)

Three flagship volumes, with:

- new invariant 'TNG model' Pillepich: 2018a, Weinberger: 2017
- Updated Planck Cosmology
- Including MHD (gravity+magneto-hydrodynamics)
- Different flagship resolutions

TNG5



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The TNG Simulations

TNG Introductory papers + 40 analyses:

Springel et al. 2018 Pillepich et al. 2018b Naiman et al. 2018 Marinacci et al. 2018 Nelson et al. 2018

TNG50 Introductory papers: Nelson et al. 2019 Pillepich et al. 2019

TNG5



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Milky-Way Analogues in Cosmological Simulations: Illustris/TNG and other numerical experiments



Milky-Way Analogues in Cosmological Simulations: Illustris/TNG and other numerical experiments

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TNG50: Nelson, Pillepich, et al. 2019

TNG50

z=1 log M* = 11.3



[jwst f200w, f115w, f070w]

Milky-Way Analogues in Cosmological Simulations: Illustris/TNG and other numerical experiments

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The TNG model: The physical ingredients behind large-volume simulations



What sets apart the TNG model from previous calculations of similar scope

U. The moving-mesh code AREPO Springel 2010

2.Updated galactic scale wind (stellar) feedback (compared to e.g. Illustris)

Pillepich, Springel, Nelson et al. 2018a



The augmented and unprecedented scope

Schaal & Springel 2015 The Shock finder, new output strategy,



JNovel two-mode scheme for SMBH feedback, particularly the new "kinetic" BH-driven pulsated wind

Weinberger, Springel, Hernquist, et al. 2017



4. Updated Yield tables, metal tracking + Neutron-star mergers sub grid recipes for production of Europium

Naiman, Pillepich et al. 2018 Pillepich, Springel, Nelson et al. 2018a

Zoom-in runs vs. Cosmological volumes

Zoom-In simulations

Typically i.e. so far, very good numerical resolution (state of the art: 100pc, 1e4-5Msun)

Typically, i.e. so far, more sophisticated and realistic galaxy physics models

Limited sampling: N_gal = 1-50

Biased Selections

Interpretation/model degeneracy: Realization or physical ingredients?

Uniform-volume simulations

Typically i.e. so far, poorer numerical resolution (state of the art: 700pc, 1e6Msun)

Typically, i.e. so far, coarser galaxy physics models (esp. treatment of the ISM)

Very good sampling: N_gal = 10k-100k

No Biased Galaxy Distributions, i.e. the "right" mass distribution and encompassing all possible assembly histories and environments

TNG50: bridging the gap between zoom-ins and large volumes

Co-PIs: A. Pillepich (MPIA), D. Nelson (MPA)

TNG50: Pillepich, Nelson et al. 2019 TNG50: Nelson, Pillepich et al. 2019

> It has run for more than one year, 24/7 on 16k computing cores!



Cosmological volume at zoom resolution





Co-PIs: A. Pillepich (MPIA), D. Nelson (MPA)



TNG50: Nelson, Pillepich et al. 2019

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TNG50: Pillepich, Nelson et al. 2019 TNG50: Nelson, Pillepich et al. 2019





Milky-Way Analogues in Cosmological Simulations: Illustris/TNG and other numerical experiments

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z = 0.39Movie Credits: Dylan Nelson The Virgo-like cluster in TNG50

With TNG50, we sample, for example, @ z=0: one 1.8e14 Msun Virgo-like cluster ~200 MW-mass haloes, thousands of dwarfs @ z=1:

 \sim 70 galaxies with > 10¹¹ Msun

600 kpc

 \sim 580 galaxies with > 10¹⁰ Msun

Milky-Way Analogues in Cosmological Simulations: Illustris/TNG and other numerical experiments

How good do these MW analogues need to be?

Milky-Way Analogues in Cosmological Simulations: Illustris/TNG and other numerical experiments

Simulating L* galaxies vs. simulating *the* Milky Way



The approach within large-volume cosmological simulations i.e. TNG

We develop models for the formation+evolution of galaxies that:

- **a.** Function across masses, spatial scales, evolutionary stages and environments
- b. Return the observed statistical properties of the *galaxy populations*
- C. Reproduce the *structural, internal properties* of individual galaxies

Against the most diverse sets of observational data and samples



We search a posteriori for disk-like galaxies in ~10^12 Msun haloes among the many hundreds/thousands and:

- **a.** See whether a "perfect" MW analog is returned and why (or why not)
- **D.** Provide physical understanding, quantitative benchmarks, or insights for the formation of L* galaxies in general and thus of the Milky Way

What can we learn from such cosmological experiments?

Discussion Points

Choose your talk! What topic? • On the diversity of galaxy disks at a given mass scale On the interplay between baryons and dark matter • On the signatures of the hierarchical growth On chemical enrichment • On the flaring of disks • On the "(un)settling" of the disks

On the diversity of galaxies at a given mass scale

TNG50: Donnari, Pillepich et al. in prep TNG50: Disk structures can be diverse, at fixed galaxy physics model

At the MW-mass scale, only a fraction of galaxies exhibit disk-like morphologies (of stellar mass or light). Not all disk galaxies exhibit two morphological disk components (thin+thick) at ~8kpc.



Milky-Way Analogues in Cosmological Simulations: Illustris/TNG and other numerical experiments

TNG50: Disk structures can be diverse

At the MW-mass scale, only a fraction of galaxies exhibit disk-like morphologies (of stellar mass or light). Not all disk galaxies exhibit two morphological disk components (thin+thick) at ~8kpc.

It depends on galaxy to galaxy!



TNG50: Disk structures can be diverse

At the MW-mass scale, only a fraction of galaxies exhibit disk-like morphologies (of stellar mass or light). Not all disk galaxies exhibit two *morphological* disk components (thin+thick) at ~8kpc.



TNG50: Disk structures can be diverse

At the MW-mass scale, only a fraction of galaxies exhibit disk-like morphologies (of stellar mass or light). Not all disk galaxies exhibit two morphological disk components (thin+thick) at ~8kpc.



TNG(50): The general properties of L* galaxies can span large ranges



Within 0.3dex in stellar mass,

- Disk scale lengths can vary by a factor of 3
- SFRs can vary by more than an order of magnitude
- Mass-Weighted averaged stellar ages can vary by 3-4 Gyrs

TNG50: Donnari, Pillepich et al. in prep

Illustris: The stellar mass assembly histories of MW-mass galaxies can vary...



... a lot!

at z~2, MW-progenitors can span anything between 10e9 and 2e10 Msun

Disclaimer: here, no selection in morphology nor SFR is applied.

ILLUSTRIS: Torrey et al. incl. AP 2015

Milky-Way Analogues in Cosmological Simulations: Illustris/TNG and other numerical experiments

On the interplay between baryons and DM

Illustris: Baryonic physics "alters" the shapes of the underlying DM haloes

Case: many MW-like objects (10^12Msun and risky) from the ILLUSTRIS simulation



With the full galaxy-physics implementation, baryons result in significantly rounder and more oblate haloes

ILLUSTRIS: Chua, Pillepich et al. 2019

Illustris/TNG: Baryonic physics "alters" the DM profiles



Illustris/TNG: Baryonic physics "alters" the DM concentration-mass relation



We have known since many years that more massive haloes are less concentrated than low mass ones

Baryonic physics affects the distribution of dark matter within haloes

In both Illustris and TNG, the DM concentration-mass relation gets modified by baryonic physics, in a notmonotonic way wrt DMO predictions.

Yet, the effects of galaxy physics can be qualitatively and quantitatively different from model to model

[TNG50/100/300: Pillepich: preliminary]

sLovell, Pillepich et al. in 2018, Chua, Pillepich et al. 2017

On the signatures of the hierarchical growth

Galaxies assemble their stars also via merging and tidal stripping, not just SF



Eris: Pillepich, Madau & Mayer 2015 Illustris: Rodriguez-Gomez, Pillepich, et al. 2016 TNG100/TNG300: Pillepich et al. 2018b Pillepich, Madau, Mayer 2015: Evolution of Eris, a MW-like galaxy, in stellar density projection



In situ - via gas inflow and star formation, ex situ - via accretion: mergers and tidal stripping

1. MW-mass galaxies can have accreted between a few to ~30 per cent of their stars

2. Ex-situ stars dominate the mass budget towards large galactocentric distances: they make the stellar haloes

The 3D Power-Law Slopes of the Stellar Haloes know their host halo's history!



ILLUSTRIS: Pillepich, Vogelsberger, Deason, et al. 2014

Observational Constraints



DM haloes which formed more recently exhibit shallower stellar haloes, at fixed halo mass

Caveat: large scatter

Illustris/TNG return differentiated stellar halo profiles for the Milky Way and Andromeda: Andromeda must have had a lively recent merger history...

Note: in fact, observational constraints on the MW stellar halo profiles are highly uncertain!

Milky-Way Analogues in Cosmological Simulations: Illustris/TNG and other numerical experiments

The power-law slope of the MW stellar halo may depend on tracers

Metal-rich stars "trace" a steeper stellar halo than metal-poor stars AGB, RGB, and RRLyrae stars can return quite different stellar halo slopes



Milky-Way Analogues in Cosmological Simulations: Illustris/TNG and other numerical experiments

Slope perpendicular to

the disk

On chemical enrichment

TNG100: A large spread in Europium abundances emerges in MW simulations



NOTE: The ansatz is that Europium is produced in neutron-star neutron-star mergers, modeled with a DTD and with yields re-scaled from the SNIa tables.

Here, MW analogues = 10^{12} Msun haloes and disky

Europium abundances show **no** correlation with merger history, present day galactic properties, and average galactic stellar population age.

The Eu/Fe spread at low metallicities is sensitive to gas properties during redshifts z=2-4:

Highly Eu enhanced stars originate from older periods of star formation than those without strong enhancements, in period when the cosmic gas phase distribution of [Eu/Fe] was less homogeneous than it is presently.

TNG100: Naiman, Pillepich et al. 2018

On the flaring of disks

The Galaxy's disk flares... and so those of some zoom simulations

Observations suggest that in the Galaxy at high vertical distances from the midplane, disks are not composed only of old stars: at larger distances from the galactic centre, young stars dominate



Slides Credit: M. Donnari

TNG50: Disk flaring is a very frequent phenomenon

Flaring emerges in all TNG50 MW analogues

Izl vs. galactocentric distances , color coded by stellar age [Gyr], in 3 random TNG50 MW analogues



- In the mid-plane, typically the average age *decreases* for larger R, at least up to a certain distance
- At fixed R, the ages of star particles *increases* for larger IzI

TNG50: Donnari, Pillepich et al. in prep

TNG50: Disk flaring is a very frequent phenomenon

Flaring emerges in all TNG50 MW analogues

Izl vs. galactocentric distances, color coded by stellar age [Gyr], in 3 random TNG50 MW analogues 439131 451831 457939 12 4 4 12 10 8 0 8 9 4 9 6 9 6 ه Age [Gyr] [z| [kpc] [z| [kpc] [z| [kpc] Age [Gyr] 8 -2 $^{-4}$ 12 14 2 8 10 6 8 10 12 14 12 14 6 10 8 R_{aal} [kpc] R_{gal} [kpc] R_{gal} [kpc] MW 451831 MW 457939 =0.11 kpc MW 439131 =0.03 kpc⁻¹ [kpc] =0.08 kpc [kpc] Scaleheight h_z [kpc] T N N F 0-3 Gyr 0-3 Gyr 0-3 Gyr 3-6 Gyr 3-6 Gvr 3-6 Gyr د ^م 6-9 Gyr Scaleheight h_z 0.13 kpc 6-9 Gvr 6-9 Gyr Scaleheight h >9 Gyr >9 GVI >9 Gyr 8 10 12 14 8 10 12 14 6 8 10 6 6 12 14 R_{gal} [kpc] R_{gal} [kpc] R_{gal} [kpc]

Scale height vs. galactocentric distances , in bins of stellar ages, in 3 random TNG50 MW analogues

The scale heights of stars of fixed ages 'flares' outwards

TNG50: Donnari, Pillepich et al. in prep

On the (un?)settling of disks

Milky-Way Analogues in Cosmological Simulations: Illustris/TNG and other numerical experiments

We can extract kinematics from TNG50 galaxies, also at high z

TNG50: Pillepich, Nelson, et al. 2019



Vrot = max of rotation curves

 σ = average in pixels of 0.5kpc (where V is max)

We can extract kinematics from TNG50 galaxies from thousands of galaxies!



Milky-Way Analogues in Cosmological Simulations: Illustris/TNG and other numerical experiments

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TNG50: Star-forming galaxies have rotationally-supported gas disks since z~3-4



TNG50: Older stars exhibit systematically larger velocity dispersions



Are stars born with the kinematics of their parent gas and do they get heated up after birth (i.e. unsettled)?

Or are older stars born at higher velocity dispersions?

Credits: M. Donnari (MPIA)

Illustris, TNG100 and TNG300 are fully publicly available!

Illustris: Nelson, Pillepich, Genel et al. 2015 TNG: Nelson, Springel, Pillepich et al. 2019

The IllustrisTNG Project

The next generation of cosmological hydrodynamical simulations.

www.tng-project.org

TNG50 (for better spatially-resolved science and MW and low-mass galaxies) will be released in early 2020

Acknowledgements: The TNG Team (the developers)



Original Illustris Team + Debora Sijacki et al.

Acknowledgements: The GC-theory MPIA team (the miners)



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Physics) Research interests: Stellar halos, IllustrisTNG Simulations



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