# Three-Body Interaction in Young and Nuclear Star Clusters

Laboratory of Computational Physics mod. B

Francesco Fontana Maryam Hashemi Lorenzo Mancini Giulio Vicentini
University of Padua

#### Table of contents

- 1. Introduction
- 2. Differentiated Statistics
- 3. Comparing Properties
- 4. Mergers
- 5. Conclusion

## Introduction

#### Introduction

Differentiated Statistics

**Comparing Properties** 

Mergers

Conclusion

#### Overview

In this work we're going to study the results of N-Body simulations [2] concerning three-body encounters for two types of star cluster.

Goal of the project: study the statistics of two type of star cluster:

- Young Star Cluster (YSC);
- Nuclear Star Cluster (NSC).

#### Star clusters

A star cluster is a group of stars that share a common origin and are gravitationally bound for some length of time. Studying star clusters is important because:

- they give us important information about stellar evolutions;
- star cluster dynamics affects the formation of BBH systems with very peculiar properties[2].

# Young Star Cluster (YSC)

Young (open) clusters are usually found within the spiral arms (of the galaxy), and are generally young objects
YSC main features:

```
• Short lived: age \le 0.1 Gyr;
```

- Less massive:  $M_{cl} \ge 10^4 M_{\odot}$ ;
- Less dense:  $\rho_{core} \ge 10^4 M_{\odot} pc^{-3}$ ;
- Less fast:  $v_{\rm esc} \sim 10 km \ {\rm s}^{-1}$ .

Open clusters usually consist of young blue stars.

#### Nuclear Star Cluster (NSC)

Globular clusters consist of old stars (probably just a few hundred million years younger than the universe itself) and they are very similar to Nuclear clusters.

#### NSC main features:

```
• Long lived: age \le 10 Gyr;
```

• More massive:  $M_{cl} \ge 10^6 M_{\odot}$ ;

• More dense:  $\rho_{core} \ge 10^6 M_{\odot} pc^{-3}$ ;

• Faster:  $v_{esc} \sim 100 km \ s^{-1}$ .

# Importance of star cluster dynamics

#### **Gravitational** waves

Invisible ripple in space-time, predicted by Einstein, that travel at the speed of light.

Some examples of events that could cause gravitational waves are:

- · when a star explodes asymmetrically (called a supernova);
- · when two big stars orbit each other;
- · when two black holes orbit each other and merge.

**GWs** were detected for the first time in 2015 thanks to the G-W observatory **LIGO** [1] [2]

## **Three-Body Interactions**

During a three-body interaction, i.e. an interaction between a binary and a single star, different events can happen:

- · Fly-bies;
- Exchanges;
- Ionizations;
- Mergers.

#### Simulation

We are provided with **two separated data-sets**, one for YSC and one for NSC, with  $10^4$  simulations for each of them. For each step ( $\sim 10^3$ ) of the simulations we have:

 masses, positions and velocities for each of the three black holes.

All the quantities in the file are expressed in N-Body units (we'll discuss this later).

#### **Analysis**

Two main steps (for both YSC and NSC):

- 1. Determine the type of event for each simulation (differentiated statistics);
- Compare the properties of the final population of binary black holes and identify the main differences (e.g. semi-major axis and total mass) between the two star cluster.

#### **Differentiated Statistics**

Introduction

Differentiated Statistics

**Comparing Properties** 

Mergers

Conclusion

## **Binding Energy**

We can exploit the binding energy between couples of BHs in order to understand the class of event [3].

$$E_{m_1 m_2}^{int} = \frac{1}{2} \mu v^2 - \frac{G m_1 m_2}{r}$$

where  $\mu$  is the **reduced mass** of the two BHs, while v and r are, respectively, the **relative velocity** and the **relative position** of the two masses.

If  $E_{m_1m_2}^{int}$  is negative then the couple of BHs form a binary system.

#### Classes of events

Given the binding energy, we can identify the various events in the following way:

- Fly-by  $\to E_{0-1} < 0$ ,  $E_{1-2} > 0$ ,  $E_{2-0} < 0$ ;
- Exchange  $0 \to E_{0-1} > 0$ ,  $E_{1-2} < 0$ ,  $E_{2-0} < 0$ ;
- Exchange1  $\rightarrow E_{0-1} > 0$ ,  $E_{1-2} > 0$ ,  $E_{2-0} < 0$ ;
- Ionization  $\to E_{0-1} > 0$ ,  $E_{1-2} > 0$ ,  $E_{2-0} < 0$ ;

If an event does not follow any of these cases, then we label it as Unclassified.

#### Mergers

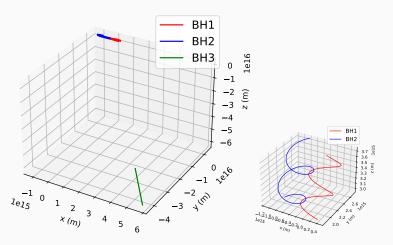
#### Mergers are the most interesting class of event:

• we can observe them with gravitational waves, which can tell us a lot of information on the properties of black holes.

In the simulation those are individuated when one of the masses is equal to zero  $m_0=0|m_1=0|m_2=0$ .

#### Not happened events

For some events more simulation time is required.



**Figure 1:** 3-dimensional plot of trajectories. On the right a zoom on the binary system.

#### Not happened events

To differentiate from fly-by we check if the third mass is approaching or moving away from the binary system.

Giving a look to the distance between the third BH and the binary, at the end of the simulation and 10 instants before it.

- $d_{1-0} < d_0 \longrightarrow \text{fly-by}$ ;
- $d_{1-0} > d_0 \longrightarrow \text{not happened}$ .

#### **Outcome statistics**

event	#simulations	event	#simulations
Exchange0	443	Exchange0	313
Exchange1	1678	Exchange1	727
Fly_by	7228	Fly_by	7927
Ionization	63	Ionization	1009
Merger	11	Merger	22
Unclassified	188	Unclassified	1
Not Happened	389	Not Happened	1

**Table 1:** Tables with the results of the event identification between YSC (left table) and NSC (right table).

# **Comparing Properties**

Introduction

Differentiated Statistics

**Comparing Properties** 

Mergers

Conclusion

## **Properties distribution**

In order to compare the properties of the final population of the black holes and identify the main differences between the two star clusters we plot distributions of two main physical properties:

- masses distributions
- · semi-major axes distributions

Moreover, we can give a quantitative value of similarity between the distributions performing a **Kolmogorov-Smirnov test**.

## From N-body to physical units

Before presenting the results, it is important to convert the data in physical units. Remember that:

- $L_{code} = L_{phys}/L_{scale}$
- $M_{code} = M_{phys}/M_{scale}$
- $T_{code} = T_{phys}/T_{scale}$

with:

$$L_{scale} = 1 \text{ pc}$$
  $M_{scale} = 1M_{\odot}$   $T_{scale} = \sqrt{\frac{(L_{scale})^3}{G*M_{scale}}}$ 

In the following slides we're going to show some plots for the mass and semi-major axis distributions

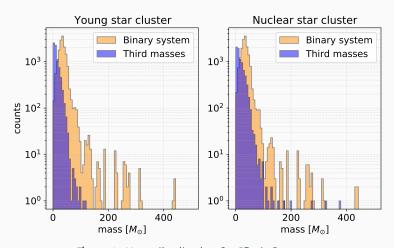


Figure 2: Mass distribution for "fly-by" events.

## **Exchange**

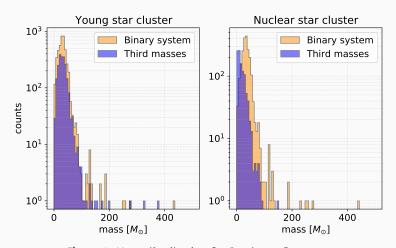


Figure 3: Mass distribution for "exchange" events.

#### Ionization

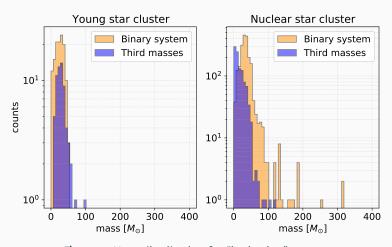


Figure 4: Mass distribution for "ionization" events.

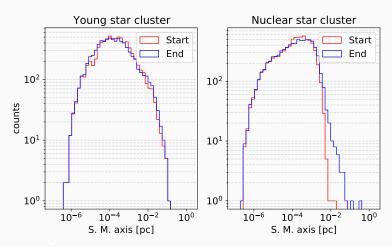


Figure 5: Semi major axis distribution for "fly-by" events.

## Kolmogorov-Smirnov test

Useful for comparing two distributions:

- · Non-parametric test for 1-dim probability distributions
- It's based on the distance between the empirical CDFs
- · In *Python* it is implemented in the *scipy* library

## Kolmogorov result for "fly-by"

Stat.	pvalue	_	
0.059	0.00112		0.

Stat.	pvalue			
0.0663	0.0205			

Stat.	pvalue			
0.265	6.00e-44			

Table 2: Results of Kolmogorov test for fly-bies: initial\_young vs. final\_young (left), initial\_nuclear vs. final\_nuclear (middle), final\_young vs. final\_nuclear (right).

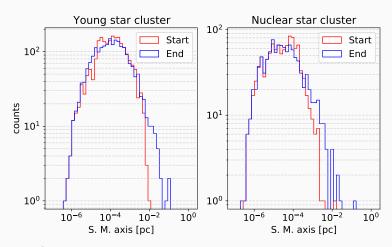


Figure 6: Semi major axis distribution for "exchange" events.

## Kolmogorov result for "exchanges"

Stat.	pvalue	Stat.	pvalue	-	Stat.	pvalue
0.0363	0.122	0.0413	0.336		0.277	1.04e-47

Table 3: Results of Kolmogorov test for exchanges: initial\_young vs. final\_young (left), initial\_nuclear vs. final\_nuclear (middle), final\_young vs. final\_nuclear (right).

# Mergers

Introduction

**Differentiated Statistics** 

**Comparing Properties** 

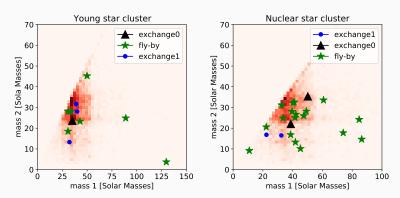
Mergers

Conclusion

## Merger events

- Mergers are the most interesting and exotic phenomena that happened in a dynamical simulation of star cluster
- Given the poor quantity of data that correspond to such events, it is meaningless to study the statistic distributions of their properties
- Instead, we can give a look to their features singularly, for example checking from which type of event they occur.

#### Mass distribution



**Figure 7:** Scatter plot of the masses of binaries for merge event, subdivided from which type of event they occurred. On the background (red), a scatter plot of all masses for all the event

## Some trajectories of Mergers

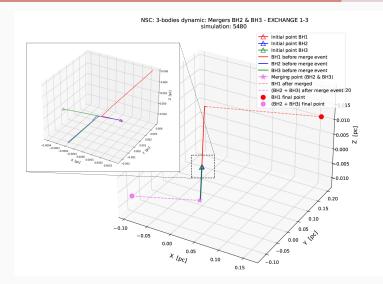


Figure 8

#### **Future Mergers**

In the end, it is interesting to understand how the systems will evolve in the universe life-time. Indeed, it is possible to estimate which event did not merge during the simulation but it is supposed to merge during the lifetime of the universe.

## Computation of $t_{GW}$

#### 2 cases: (Keplerian mechanics)

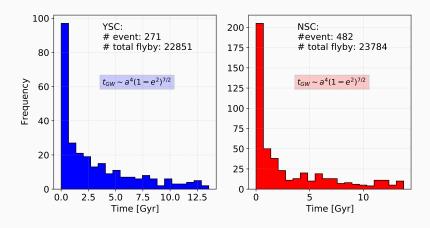
Peters equation (1964) [2]:
 ( dependence on both e and a )

$$t_{GW} = \frac{5}{256} \frac{c^5}{G^3} \frac{a^4 (1 - e^2)^{7/2}}{m_1 m_2 (m_1 + m_2)}$$

Approximated Peters equation:
 ( only dependence on a → quasi-circular orbit, e = 0)

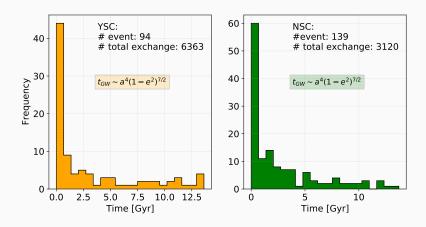
$$t_{GW} = \frac{5}{256} \frac{c^5}{G^3} \frac{a^4}{m_1 m_2 (m_1 + m_2)}$$

#### Fly-By



**Figure 9:** Distribution of fly-by events that will merge in a Hubble time **after the simulation** 

## **Exchanges**



**Figure 10:** Distribution of exchange events that will merge in a Hubble time **after the simulation** 

# Summary of future mergers

	NSC	YSC	
event	counts		
fly_by exchange	482 139	271 94	

Table 4

## Conclusion

Introduction

Differentiated Statistics

**Comparing Properties** 

Mergers

Conclusion

#### Summary and results

In the present work, we study the outcomes of simulation concerning three-body interactions. In particular, we:

- exploit some property (e.g. binding energy) in order to distinguish different events
- study the statistics of different events for both Young and Nuclear star clusters
- perform a quick statistical test in order to verify our results (e.g. Kolmogorov test)

#### **Future developments**

Here we discuss how this work can be developed further:

- perform more advanced statistical tests (e.g. Bayes Factor) in order to compare distributions and thus verify our results
- perform a different (and more advanced) estimation of future mergers

#### References i



J. Aasi, B. P. Abbott, R. Abbott, et al.

Advanced LIGO.

Classical and Quantum Gravity, 32(7):074001, mar 2015.



🔋 U. N. Di Carlo, N. Giacobbo, M. Mapelli, M. Pasquato, M. Spera, L. Wang, and F. Haardt.

Merging black holes in young star clusters.

Monthly Notices of the Royal Astronomical Society, 487(2):2947-2960, May 2019.



M. Mapelli.

Astrophysics of stellar black holes, 2018.

#### Individual contributions

- Francesco Fontana: Pre-processing of data, differentiated statistics, trajectories plots for mergers during simulations, estimations of coalescence time for future Mergers
- Maryam Hashemi: Theoretical introduction, Odds Ratio and conclusion part.
- Lorenzo Mancini: Analysis of the statistics between YSCs and NSCs (mass and semi-major axis distributions), statistical test (Kolmogorov-Smirnov) over S. M. axis distributions.
- Giulio Vicentini: Classification of the events, differentiated statistics, analysis of events that didn't happen within the simulation time and analysis of the Mergers.

Thanks for your attention!