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#### TITLE

# Surface or skeleton? Automatic hierarchical clustering of 3D point clouds of bronze frog drums for heritage digital twins

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# CIPA 2023 Florence

Documenting, Understanding, Preserving Cultural Heritage: Humanities and Digital Technologies for Shaping the Future



## MATERIALS

Bronze drums (Lu et al., 2020)

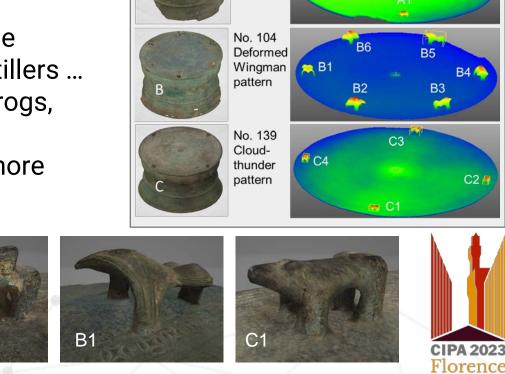
- Spiritual, sacrifice, and musical instruments
- Across South China and Southeast Asia since 700s BCE
- Traditional storage: buried in soil (now >2,400 conserved)

#### Decorative bronze frogs

- A variety (design, size, materials) evolved over time
- "bronze drums often unearthed in Guangxi by the tillers ... with a perfect circle with bent body ... five sitting frogs, each with a baby on its back." (Zhou 1187)
- "surrounding frogs indicate [the chief's] **title**; the more frogs, the more honorable title." (Zhu 1948)



Discovery of a 2,000-yr drum in Guangxi, on 25 May 2023 (Photo src: news.cn)



No. 60

Cloudthunder pattern

(c)

C2 /

(b)

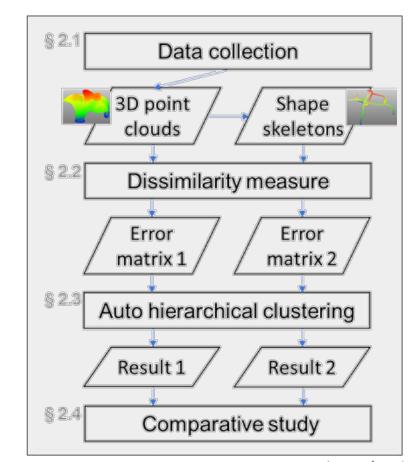
# AIM AND METHODS

#### Objectives

- To **understand** the 3D details of bronze frogs using clustering for heritage digital twin
- To **compare** 3D surface and skeleton (abstract, topology-aware, light-sized) as source of clustering

#### Methods in 4 steps

- Data curation (skeletonization using CGAL)
- Geometric dissimilarity matrix (Xue et al. 2020)
- Unsupervised hierarchical clustering (auto threshold)
- Comparison of results from the two sources





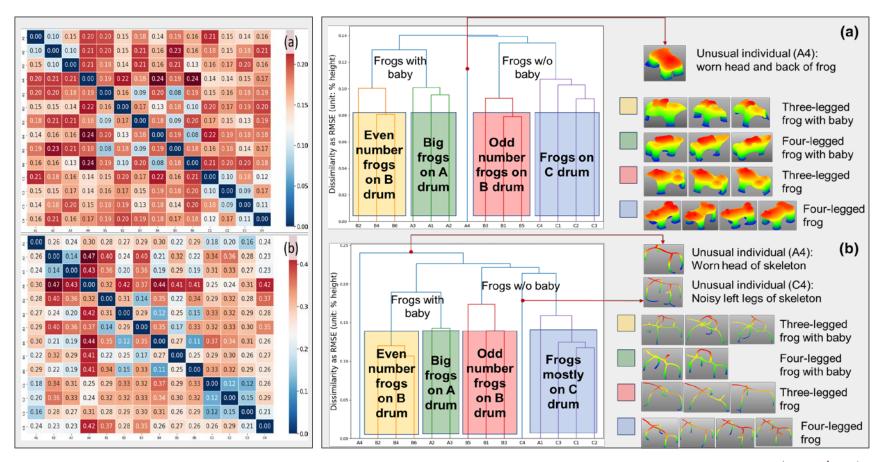
# RESULTS

Dissimilarity matrices

- Similar patterns
- $\max_{ske}/\max_{sur} \approx 2$

Clustering (Obj. #1)

- Four groups in both
- Reflecting the style
- In line with the instruments and shape groups
- Outlier (damanged) highlighted automatically



Dissimilarities (a) Surface; (b) skeleton Hierarchical clustering (threshold = (min+max)/2)

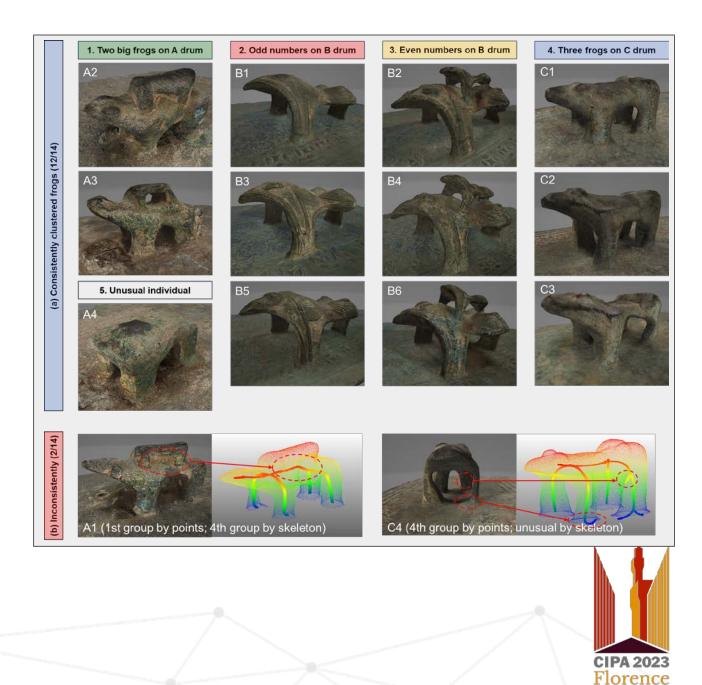


# RESULTS

#### Comparative results (Obj. #2)

- Same for 12 out of 14 ✓
- Assuming 3D surface grouping was true, the metrics of skeleton were: *Precision* = 0.850, *Recall* = 0.883,  $F_1 = 0.866$
- 2 inconsistencies due to: **limited presentation** of traditional (inscribed ball) skeleton in CGAL

		Group using shape skeleton				
		Ι	II	III	IV	V
Group using surface point clouds	I. Three-legged with baby	3				
	II. Four-legged with baby		2		1	
	III. Three-legged			3		
	IV. Four-legged				3	1
	V. Unusual		,, <b>.</b> 0.	Sec. Constraints		1



## CONCLUSION

Bronze frogs on drums

- Widely spread in Ancient South China and Southeast Asia
- Qualitatively grouped and compared (similar to building Covid virus family tree)
- Both 3D surface and shape skeleton worked well
- An automatic way of grouping new 3D scans (not limited to frogs) from site

Future work

- Scale-up tests
- Examining the new values of skeletons (abstraction, topology, file size)
- Revised shape skeleton definitions for heritage data (e.g., tolerance to worn corners)
- Heritage Digital Twins with unsupervised learning



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