A Peek into the Metaverse: Detecting 3D Model Clones in Mobile Games

Chaoshun Zuo, Chao Wang, and Zhiqiang Lin

USENIX Security 2023

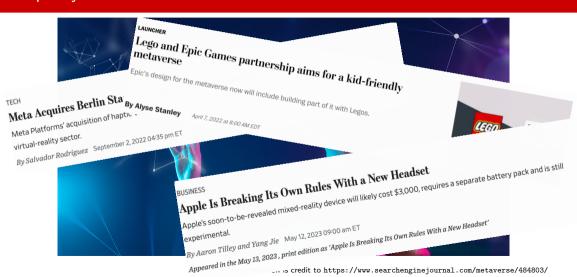


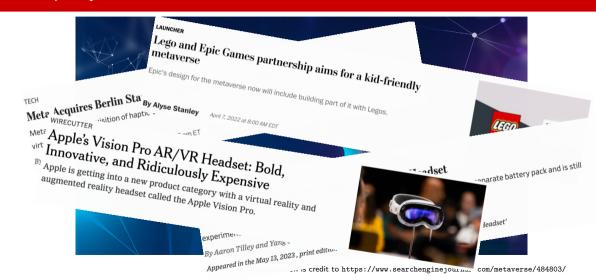
* Demonstration is credit to https://www.searchenginejournal.com/metaverse/484803/



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REAL ESTATE

The Next Hot Housing Market Is Out of This World. It's in the Metaverse.

Met Despite the implosion of FTX and projections of a cryptocurrency winter.

the metaverse real estate market is expected to grow by \$5.37 billion by 2026.



Ieadset'

By Debra Kamin



3D models are vital for 3D games



An immersive scene of a 3D game

It has ...

Table



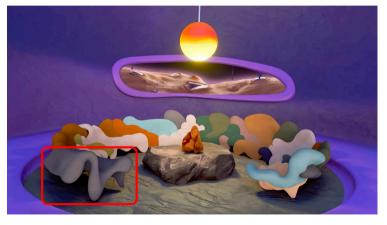
An immersive scene of a 3D game

- Table
- Figure



An immersive scene of a 3D game

- Table
- Figure
- Chair



An immersive scene of a 3D game

- Table
- Figure
- Chair
- Light



An immersive scene of a 3D game

- Table
- Figure
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- Scene



An immersive scene of a 3D game

- Table
- Figure
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- Scene
- 6 ...

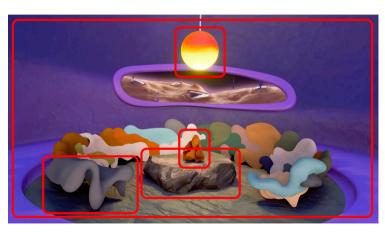


An immersive scene of a 3D game

It has ...

- Table
- Figure
- Chair
- Light
- Scene
- **6** ..

All of them are 3D models!



An immersive scene of a 3D game

The art The 3D Model



The art The 3D Model







► Size: 714MB

► Vertices: 945.8K+

► Triangles: 1.9M+



\$ 3,499!







Sonic the Hedgehog: Representative of SEGA

This is not true!







The 3D model shown above is extracted from their games!*

^{*} Sonic the Hedgehog is an open-sourced model.

Multiple reasons that 3D models are currently not being protected properly...

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Distribute w/ games

Multiple reasons that 3D models are currently not being protected properly...



Distribute w/ games



Render on client

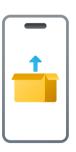
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Distribute w/ games



Render on client



Extract easily

Real cases that 3D models get stolen

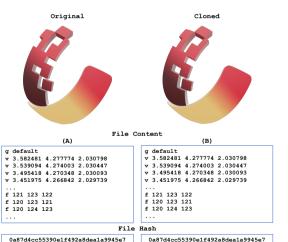
General Discussions finding stolen models	30 days ago	213 ③	7
• General Discussions Model Thief Collection	Last post by <u>vis-all-3d</u> about 1 month ago	2,092	60
Settling / Buyring 3D Models Stolen models	Last post by dustinmeyer 1234 5 months ago	178	1 🖵
Selling / Buying 3D Models Please Please use watermark on your images!!Request for all 3d print character artists!!	Last post by <u>HP-DSignZ</u> 5 months ago	272 ③	13
Selling / Buying 3D Models Stolen models	Last post by <u>RealtimeModels</u> 6 months ago	509 ③	12 🖵
General Discussions: How to deal with: Payment reversal - no cardholder authorization.	Last post by <u>TheGoodBrick</u> 7 months ago	255	9
General Discussions: Blasted copycat cgt seller	Last post by <u>LemonadeCG</u> 12 months ago	302 ③	2
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Last post by 512pixel

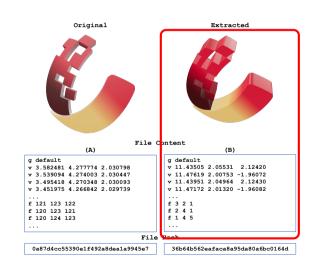
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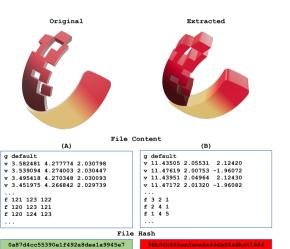
Detect models that look exactly the same?



Detect models that look exactly the same?

Models can be ...

- Squashed
- Stretched
- ▶ ..

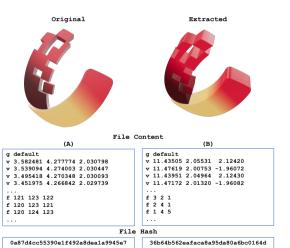


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The file hash will also be different!



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- ▶ ..

The file hash will also be different!

How to design a robust and efficient 3D model indexing scheme?

What is demanded

Challenges

- Robust algorithm to handle the noise in static 3D models
- Robust algorithm to handle the noise in dynamic 3D models
- Efficient algorithm to conduct large scale study

Our solutions

Solutions

- Robust algorithm to handle the noise in static 3D models Model representing by relative values
- Robust algorithm to handle the noise in dynamic 3D models Animation interpolation
- Sefficient algorithm to conduct large scale study Index-based 3D model database

How does a 3D model look like



g usenix

How does a 3D model look like



```
g usenix
```

v 3.582481 4.277774 2.030798

v 3.539094 4.274003 2.030447

 $\mathtt{v} \ \ \textbf{3.495418} \ \ \textbf{4.270348} \ \ \textbf{2.030093}$

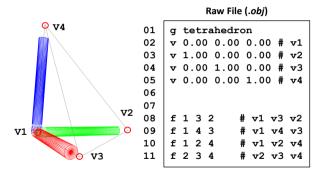
v 3.451975 4.266842 2.029739

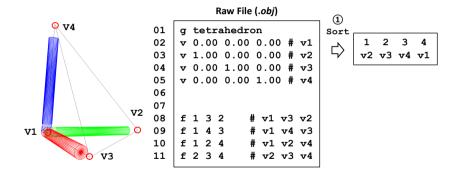
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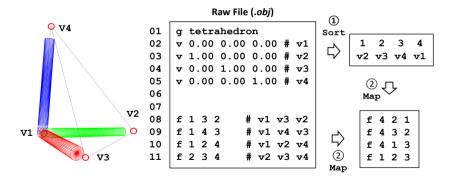
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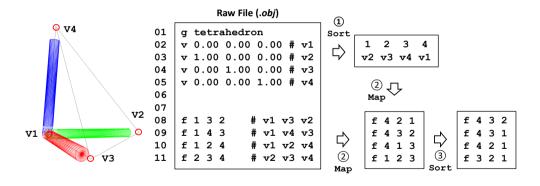


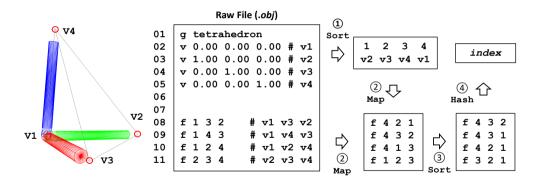
```
g usenix
v 3.582481 4.277774 2.030798
v 3.539094 4.274003 2.030447
v 3.495418 4.270348 2.030093
v 3.451975 4.266842 2.029739
...
f 121 123 122
f 120 123 121
f 120 124 123
...
```

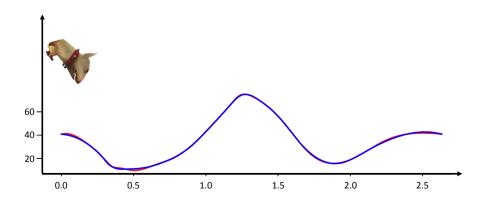


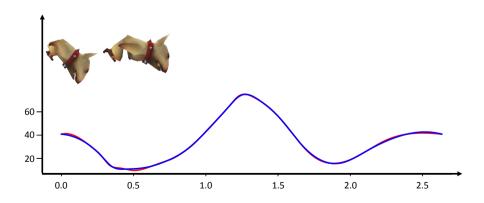


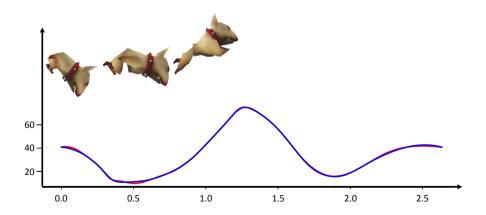


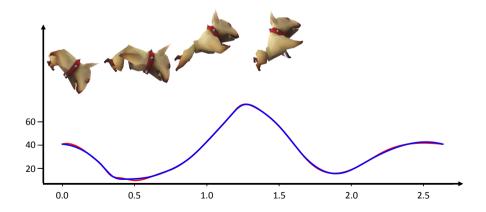


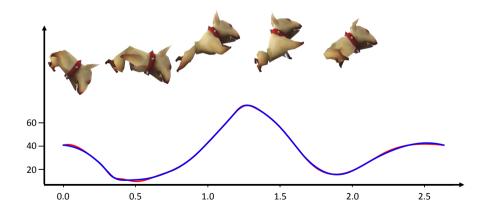


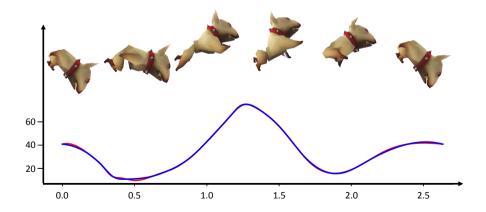












Experiment setup

Dataset

- ► Downloaded by gplaycli
- ► 176,361 Unity-based games
- ► Over **5 TB** of storage

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Logistics

- ▶ **89,519** of the games containing 3D models
- ▶ **22,517,361** static 3D models
- ▶ **7,696,801** animated 3D models

Identified cloned 3D models

Cloned static 3D models

- ► **5,557,146** distinct static 3D models
- ▶ 1,046,632 3D models being found in different games
- ► More than 80% distinct models only exist in one game

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Cloned dynamic 3D models

- ► 1,722,795 distinct dynamic 3D models
- ▶ More than 1.5M (88%) animated 3D models exist only in one game
- ► Most of them (94%) exist in one or two games

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Static 3D model clone is more common than dynamic model clone

3D models distribution across games

▶ Popular games tend to have more models, but the model complexity is decreasing

			((1)		(1	I)	(III)					
		Static 3D Models		Animated 3D Models		Model Average		Distinct Model		Model Clones		es	
# Installs	# Games	Total	Average	Total	Average	Vertices	Faces	Static	Animated	Static	Animated	Average	
500	33,182	4,969,430	149.76	1,357,767	40.92	1,766.91	1,470.54	1,404,839	338,742	409,252	72,485	14.52	
1K	13,177	2,948,531	223.76	919,989	69.82	1,612.37	1,325.13	918,647	198,108	398,695	62,881	35.03	
5K	5,475	1,392,774	254.39	429,659	78.48	1,646.80	1,341.39	515,873	114,060	241,060	35,022	50.43	
10K	11,659	3,389,492	290.72	1,249,804	107.20	1,630.57	1,320.78	1,033,665	247,982	452,565	68,981	44.73	
50K	4,528	1,468,631	324.34	540,708	119.41	1,729.43	1,378.50	486,907	137,904	264,041	33,113	65.63	
100K	9,460	2,998,522	316.97	1,161,467	122.78	1,613.92	1,318.86	949,642	226,499	428,137	67,664	52.41	
500K	3,457	1,265,555	366.08	446,742	129.23	1,592.51	1,309.02	476,733	133,743	242,269	37,844	81.03	
1M	5,521	2,323,020	420.76	796,189	144.21	1,277.82	1,040.69	961,134	371,945	350,072	43,033	71.20	
5M	1,313	663,554	505.37	234,583	178.66	1,291.44	1,038.19	285,578	88,566	122,666	16,824	106.24	
10M	1,448	890,168	614.76	473,049	326.69	1,000.09	825.86	483,649	131,387	174,879	25,898	138.66	
50M	202	152,370	754.31	60,573	299.87	853.12	756.63	77,433	12,977	29,382	1,798	154.36	
100M	89	51,016	573.21	23,896	268.49	923.47	838.93	37,040	5,664	10,367	364	120.57	
500M	7	2,934	419.14	1,989	284.14	760.56	702.61	2,271	123	243	0	34.71	
1B	1	1,364	1,364.00	386	386.00	730.06	695.31	1,048	376	316	10	327.00	

3D models distribution across games

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FP/FN analysis

False positives

Dissimilar models identified as similar

- ► Randomly selected:
 - ▶ 1,000 static models
 - ► 1,000 dynamic models
- ► Manual reviewing found: **0** FP

FP/FN analysis

False positives

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False negatives

Appear identical but bear different hashes

- ► Gathered **50** common object words
 - ► 30 models in each group
 - ► 1,500 models in total
- ► Manual reviewing found: **0** FN

Manually reviewing results

Game clone

- ► Attackers may repackage an existing game
- ▶ The original game and the repackaged one would exhibit a high overlapping rate

	Victim Game	# Install	Category	Developer	Game w/ Cloned Models	# Install	Category	Developer	Removed?
9	Flip Diving 50M		Sports	MotionVolt Games Ltd	Cliff Diving	5K	Simulation	BBLoveG	✓
<u>.</u>	Zombie 3D Gun Shooter	10M	Arcade	Fun Shooting Games .	Unkilled Hunter	1K	Action	Bsbh Studio	✓
0	Agent Action	10M	Action	Saygames Ltd	Agent Legend	100	Adventure	Keep200019	1
Ĕ	Bike Racer 10M		Racing	Games Saga	Stunt Bike Racer 3D	100	Simulation	Liudingjun	✓
S	Shoot Goal	10M	Sports	Bambo Studio	Dream Football Strike	10K	Sports	Crazy Sports Co.	✓
a	Temple Run	500M	Arcade	Imangi Studios	Eternal Parkour	500	Action	Mangoqueen	✓
ē	Join Clash 3D	100M	Arcade	Supersonic Studios LTD	Join Clash 3D: Crowd Rush	5K	Arcade	Gamezo	✓
ᄀ	Talking Tom Hero Dash	100M	Action	Outfit7 Limited	Jungle Cat Runner	100	Role Playing	Vigour3D	✓
ea	Hungry Shark Evolution	100M	Arcade	Ubisoft Entertainment	Scuba Hunter	100	Adventure	Arcadian Lab	X
므	Robot Helicopter	5M	Action	Naxeex Robots	Us Army Robot Helicopter	5K	Strategy	Dreams Games Inc,	/
e	Subway Surfers	1,000M	Arcade	Sybo Games	Bob The Robber Runner	100	Adventure	Appspros	X
흔	Cover Strike	100M	Action	Free Actions	Military Commando Mission	1M	Adventure	New Games 2021 .	✓
	Color Bump 3D	100M	Arcade	Good Job Games	Color Bumper Ball	1K	Arcade	Coz Rdev	X
þ	Flight Simulator	100M	Simulation	I6 Games	Airplane Free Fly Simulator	10K	Simulation	Bf Games Studio	✓
ĭ	Bridge Race	100M	Casual	Supersonic Studios Ltd	Tower Stack	1K	Casual	Jacob Van Haag	1

Manually reviewing results

Idea clone

- ► Attacker may replicate the idea by creating a similar game
- ▶ This replication could possibly appropriate some models from the original game

	Victim Game	# Install	Category	Developer	Game w/ Cloned Models	# Install	Category	Developer	Removed?
ne	Flip Diving	50M	Sports	MotionVolt Games Ltd	Cliff Diving	5K	Simulation	BBLoveG	✓
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ဗိ	Shoot Goal	10M	Sports	Bambo Studio	Dream Football Strike	10K	Sports	Crazy Sports Co.	/
е	Temple Run	500M	Arcade	Imangi Studios	Eternal Parkour	500	Action	Mangoqueen	✓
6	Join Clash 3D	100M	Arcade	Supersonic Studios LTD	Join Clash 3D: Crowd Rush	5K	Arcade	Gamezo	✓
ū	Talking Tom Hero Dash	100M	Action	Outfit7 Limited	Jungle Cat Runner	100	Role Playing	Vigour3D	1
ea	Hungry Shark Evolution	100M	Arcade	Ubisoft Entertainment	Scuba Hunter	100	Adventure	Arcadian Lab	X
P	Robot Helicopter	5M	Action	Naxeex Robots	Us Army Robot Helicopter	5K	Strategy	Dreams Games Inc,	✓
ne	Subway Surfers	1,000M	Arcade	Sybo Games	Bob The Robber Runner	100	Adventure	Appspros	×
8	Cover Strike	100M	Action	Free Actions	Military Commando Mission	1M	Adventure	New Games 2021 .	1
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₹	Bridge Race	100M	Casual	Supersonic Studios Ltd	Tower Stack	1K	Casual	Jacob Van Haag	✓

Manually reviewing results

Model clone

- ► Attacker may be interested in a specific model
- ► Steal the specific model and use it in a game belonging to a different category

	Victim Game	# Install	Category	Developer	Game w/ Cloned Models	# Install	Category	Developer	Removed?
Je.			Sports	MotionVolt Games Ltd	Cliff Diving	5K	Simulation	BBLoveG	✓
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Victim



Join Clash 3D

Suspicion



Join Clash 3D: Crowd Rush



Victim



Join Clash 3D

100M+ installs

Suspicion



Join Clash 3D: Crowd Rush

5K+ installs



Victim



Subway Surfers

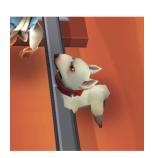
Suspicion



Bob The Robber Runner



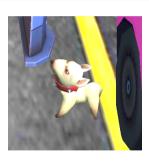
Victim



Subway Surfers

1B+ installs

Suspicion



Bob The Robber Runner

100+ installs

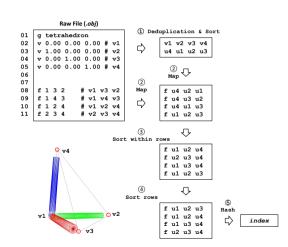
Conclusion

3DSCAN

► First **open source**, robust tool designed to identify 3D model clones within the mobile gaming sector

Evaluated w/ 176K+ mobile games

- ► Empirical Results. Identified 63.03% static, 37.07% animated 3D models are subject to cloning
- ► Unauthorized Clone Detection.
 Identified 5,238 mobile games likely containing unauthorized clones





3DSCAN Source Code

https://github.com/OSUSecLab/3DScan

SecLab @ OSU

https://go.osu.edu/seclab