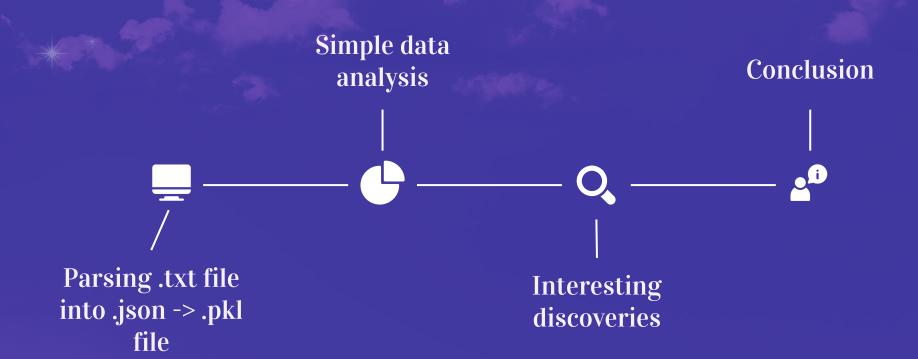


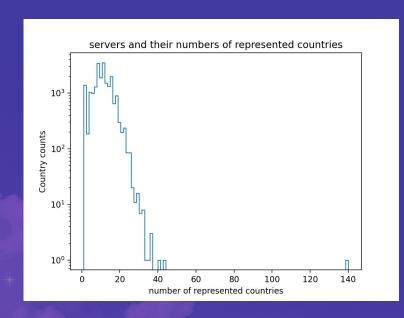
Timeline

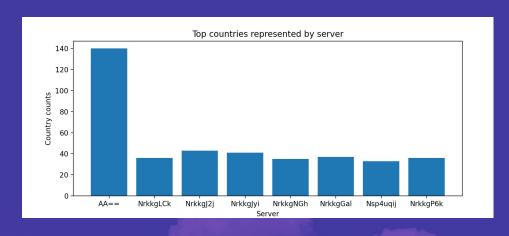




Simple data analysis

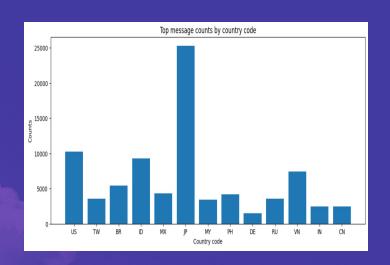
Servers w/ most country diversity

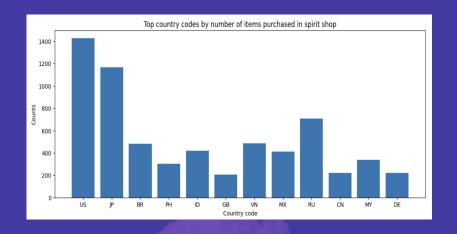




Server AA== has the most diversity in terms of countries out of all 8 servers

User engagement among countries





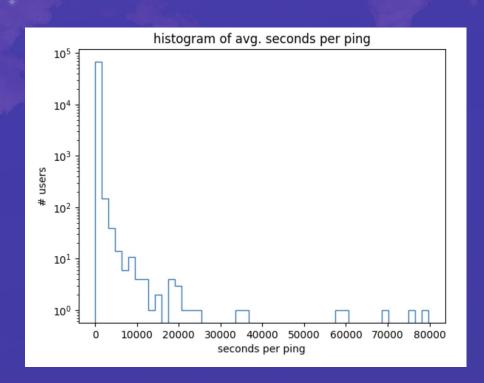
Users from **Japan** has made a lot of interactions with each other

Top 3 item-purchasing countries:
United States, Japan, and
Russia



Interesting Discoveries

Teleporting Users?



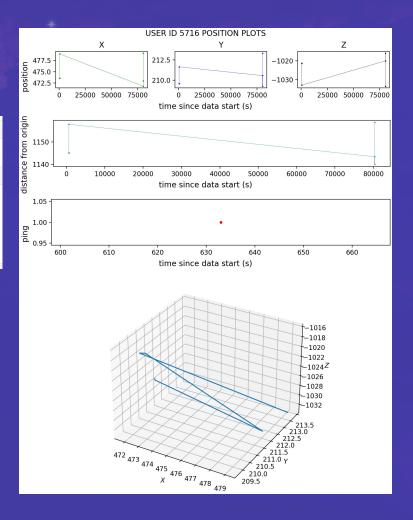
Over 90% of the dataset had less than 100 secs per ping

Players with high secs per ping signify possible teleportation

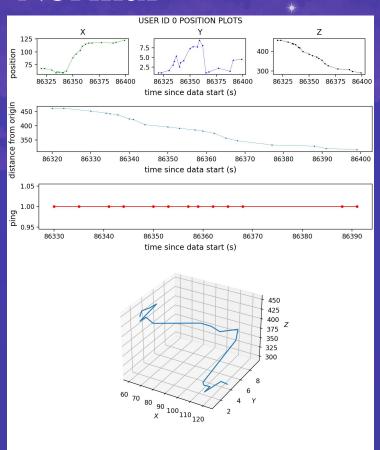
- If a player travels a lot instantly, only one ping will register for a large distance that would usually register multiple
- For a long play time with low pings, the two primary possibilities are idling (suspend mode) and teleporting

Observing P#5716

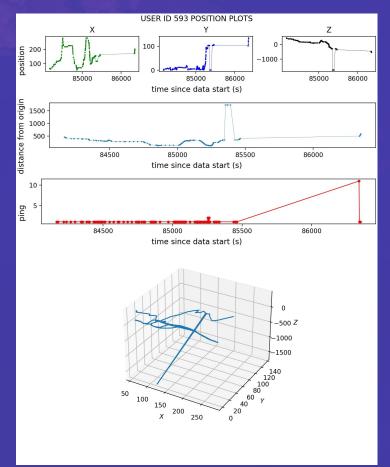
- User #5716 only had 1 ping overall but still moves around the map, seemingly with no updates in between positions
 - Seems to be a sign of teleportation



Normal



Abnormal



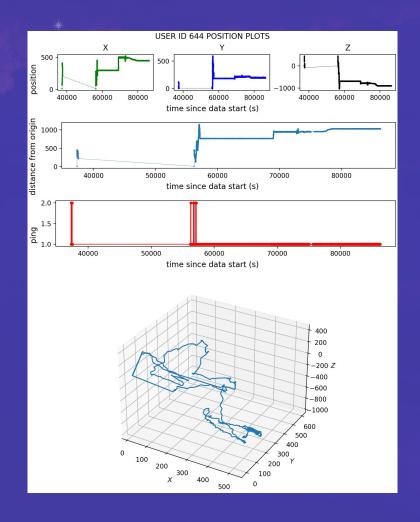
P#644 - High ping count

Things to note:

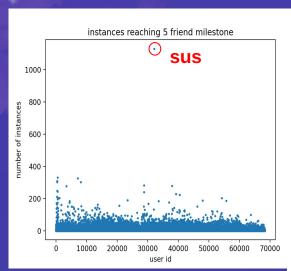
- Highest total # of pings
- Greatly increased speed over a few seconds

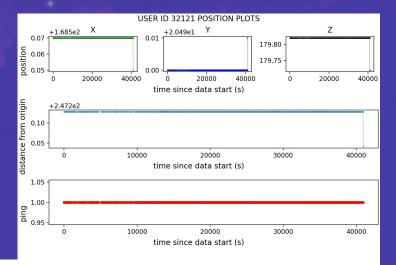
Possible indications:

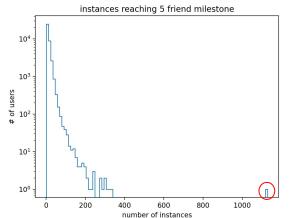
- Teleportation occurred at points of rapid speed increase
- 2. User is moving at really high speed at the point of ping spike increase

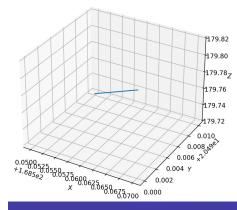


Extremely social player









Abnormal observation

- User #32121 is the outlier from the previous scatter plot
- Interestingly, this user has made over
 ~5000 friends in one game session
 - without moving!
 "Made 5 Friends" milestone occurs
 1129 times in the data
 - Player interactions are much more rare, at only a count of 84
- Total play time seems to be about 41,000 seconds, or about 11 hours
- However, we see many made 5
 friends interactions back to back (i.e. red box)

```
(1694618820.0, {'player_left': 1, 'milestone_made_5_friends': 1}), (1694618798.0, {'player_joined': 1, 'milestone_made_5_friends': 1}), (1694618794.0, {'ping': 1}), (1694618793.0, {'milestone_made_5_friends': 1, 'player_left': 1}), (1694618764.0, {'ping': 1}], (1694618769.0, {'milestone_made_5_friends': 1}), (1694618758.0, {'player_left': 1}), (1694618718.0, {'milestone_made_5_friends': 1}), (1694618718.0, {'milestone_made_5_friends': 1}), (1694618705.0, {'ping': 1, 'milestone_made_5_friends': 1}),
```

{'ping': 1, 'player_joined': 2, 'milestone_made_5_friends': 1}),

(1694618696.0, {'milestone_made_5_friends': 1}),
(1694618696.0, {'milestone_made_5_friends': 1}),
(1694618696.0, {'player_joined': 1, 'milestone_made_5_friends': 1}),
(1694618656.0, {'milestone_made_5_friends': 1}),
(1694618655.0, {'player_left': 1}),
(1694618645.0, {'player_left': 1, 'milestone_made_5_friends': 1}),
(1694618644.0, {'ping': 1}),
(1694618625.0, {'milestone_made_5_friends': 1}),
(1694618614.0, {'ping': 1}),
(1694618612.0, {'milestone_made_5_friends': 1, 'player_joined': 1}),

(1094010034.0, { Dilld : 1}),

(1694618585.0, {'ping': 1}),

(1694618464.0. {'ping': 1}).

(1694618825.0,

(1694618582.0, {'milestone_made_5_friends': 1}),
(1694618581.0, {'player_joined': 1}),
(1694618579.0, {'milestone_made_5_friends': 1}),
(1694618578.0, {'player_left': 1}),
(169461854.0, {'ping': 1}),
(169461854.0, {'player_joined': 1, 'milestone_made_5_friends': 1}),
(1694618530.0, {'player_joined': 1, 'milestone_made_5_friends': 1}),

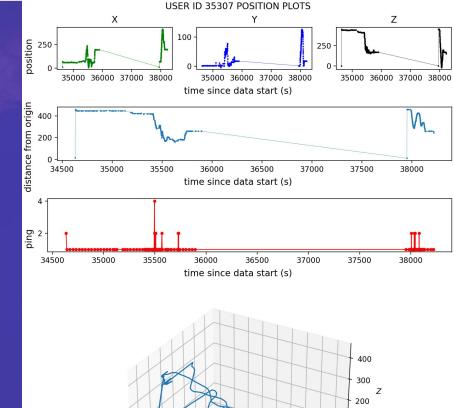
(1694618599.0, {'milestone_made_5_friends': 1}),

(1694618524.0, {'ping': 1}),
(1694618522.0, {'milestone_made_5_friends': 1}),
(1694618521.0, {'milestone_made_5_friends': 1}),
(1694618520.0, {'player_left': 1}),
(1694618515.0, {'milestone_made_5_friends': 1}),
(1694618514.0, {'player_left': 1}),
(1694618494.0, {'ping': 1}),
(1694618491.0, {'milestone_made_5_friends': 1}),
(1694618490.0, {'player_joined': 2}),
(1694618487.0, {'milestone_made_5_friends': 1}),
(1694618486.0, {'player_left': 1}),
(1694618486.0, {'player_left': 1}),
(1694618490.0, {'player_left': 1}),

Abnormally High Hand Holds

- User #35307 is an outlier with the most instances of hand holding
 - In the span of ~1 minute, initiated over
 100 hand holds, while barely moving

```
(35719.0, {'ping': 1}),
(35717.0, {'hand held': 17, 'hand released': 13}),
(35713.0, {'hand held': 12, 'hand released': 11}),
(35711.0, {'hand_held': 6, 'hand_released': 5}),
(35710.0, {'hand_released': 10, 'hand_held': 11}),
(35708.0, {'hand_held': 8, 'hand_released': 6}),
(35707.0, {'hand_held': 5, 'hand_released': 4}),
(35706.0, {'hand_held': 4, 'hand_released': 4}),
(35705.0, {'hand_held': 6, 'hand_released': 5}),
(35704.0, {'hand_held': 1, 'hand_released': 1}),
(35703.0, {'hand_held': 1, 'hand_released': 1}),
(35702.0, {'hand_held': 2, 'hand_released': 2}),
(35695.0, {'hand_held': 4, 'hand_released': 4}),
(35692.0, {'hand_released': 6, 'hand_held': 5}),
(35691.0, {'hand_released': 3, 'hand_held': 3}), (35690.0, {'hand_released': 5, 'hand_held': 5}),
(35689.0, {'ping': 1, 'hand held': 5, 'hand released': 4}),
(35688.0, {'hand_held': 2, 'hand_released': 2}),
(35686.0, {'hand held': 1, 'hand released': 1}),
(35685.0, {'hand_released': 2, 'hand_held': 2}),
(35684.0, {'hand_released': 4, 'hand_held': 3}),
(35683.0, {'hand_released': 5, 'hand_held': 5}),
(35682.0, {'hand_held': 4, 'hand_released': 3}),
(35667.0, {'hand_held': 1, 'hand_released': 1}),
(35666.0, {'player left': 1, 'buddy request': 1}).
```



, 50 100₁₅₀200₂₅₀300 350 400

100

120

100

80

Conclusions

Very large dataset- over 68k users represented

Applications to the game

Future Adaptations & Improvements

From such a huge dataset, we were able to analyze trends to report 6 different anomalous users

As the game grows in membership, picking out a few cheaters out of the many good users becomes both necessary and challenging

Instead of solely looking at the data, look in the context of the level map for movement exploits.

Also, can check if movement along a path is indicative of a bot or human player.

