

Eve Online: Learning Immunology Clustering through Video Games

? Can we leverage human pattern recognition and MMORPGs to help cluster highly domain specific information and uncover similarities between human behaviour and classical clustering algorithms?

DATA

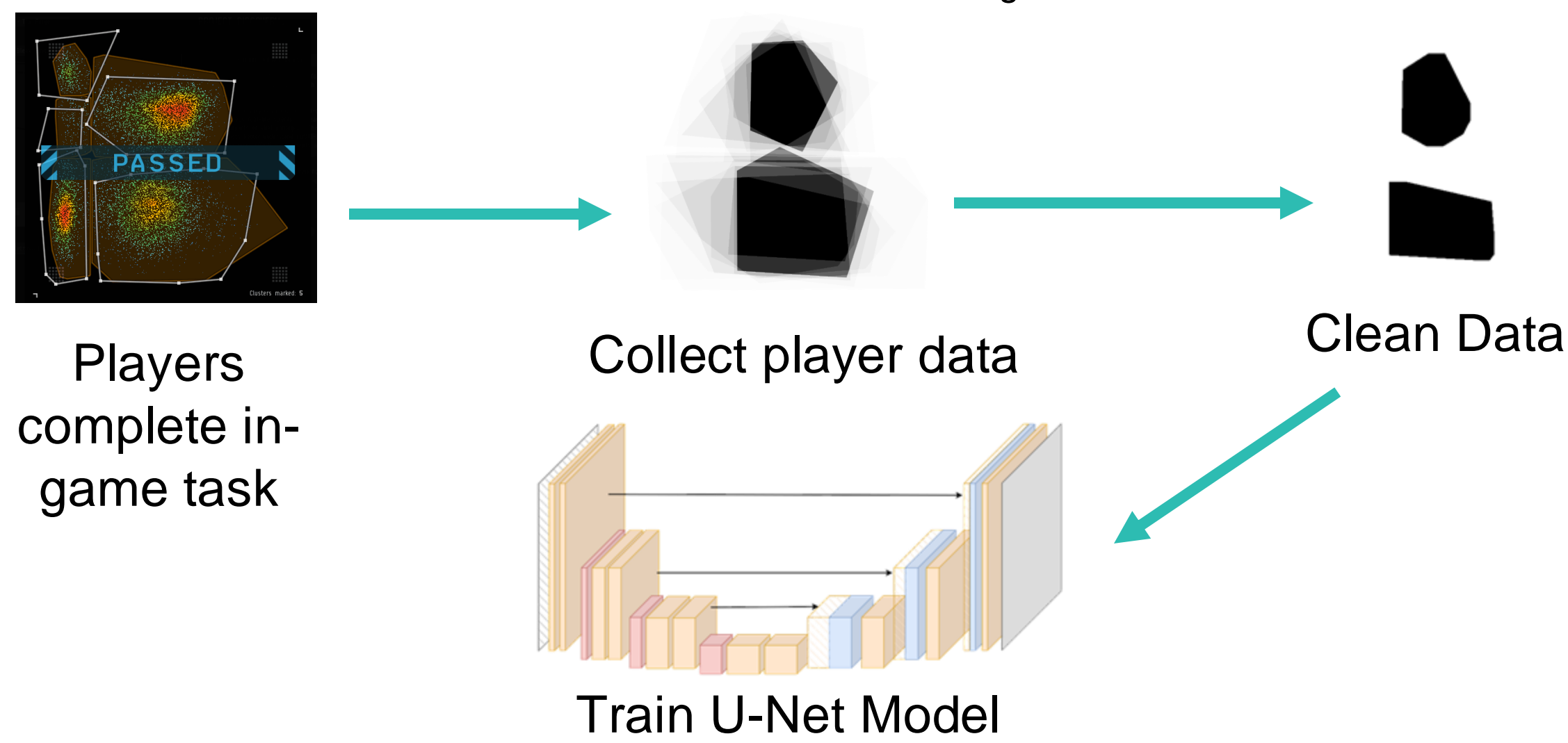
Flow cytometry data gathered from the protein structures of the Covid-19 virus was implemented as a clustering task in game for players to solve. Their solutions were then overlapped and cleaned for use as training data.

Flow cytometry: a technique to analyze properties of individual cells through a laser-based detection system



METHOD

Creating masks as well as extrapolating other perceptual data from player solutions to train a U-Net model on image segmentation tasks to mask out clusters found in images.



Classical Clustering Results

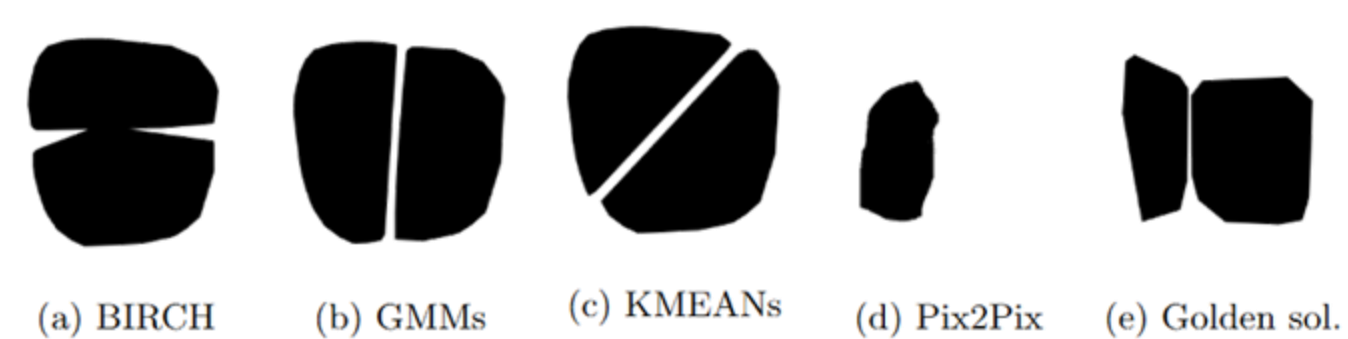


Figure 2: Two Clusters

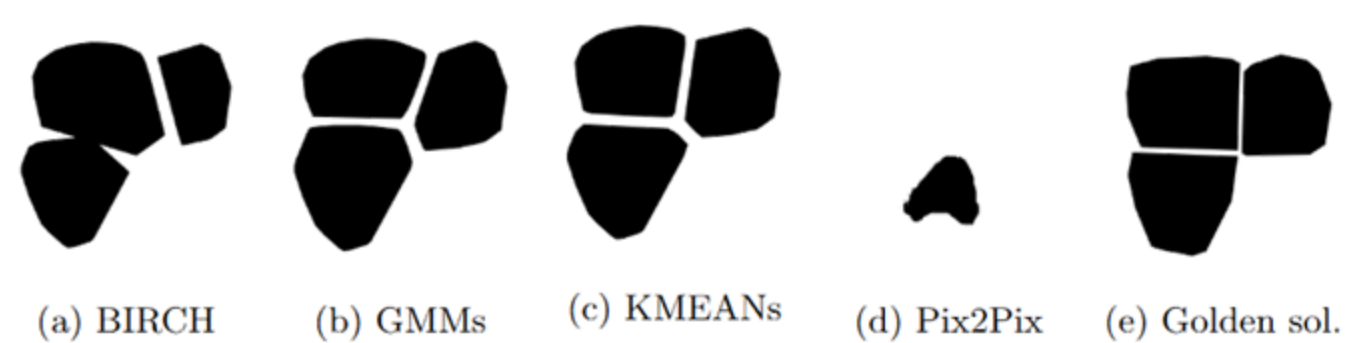


Figure 3: Three Clusters

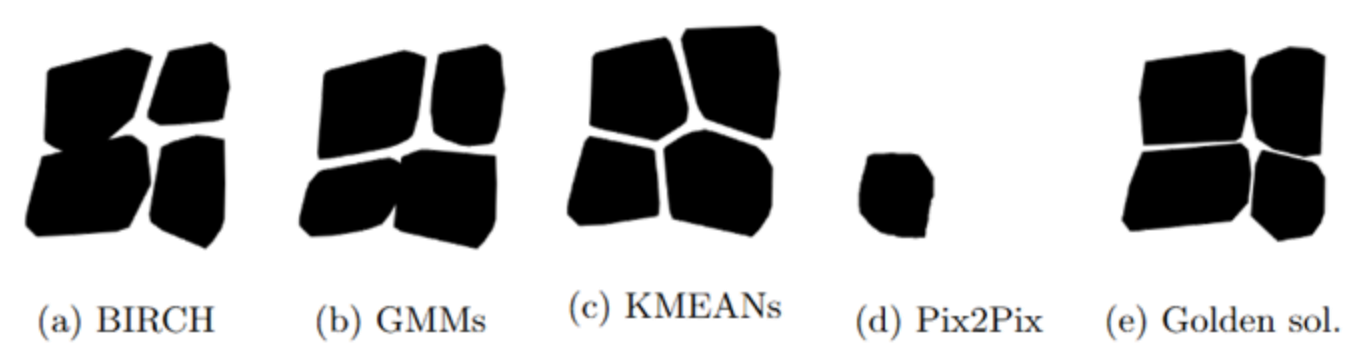


Figure 4: Four Clusters

Clustering was done for images with different number of clusters. The results were compared against a conditional generative model—which was one of the first iterations of imitation learning, that did not produce good results—and the clusters hand drawn by domain experts. The findings showed mixed results

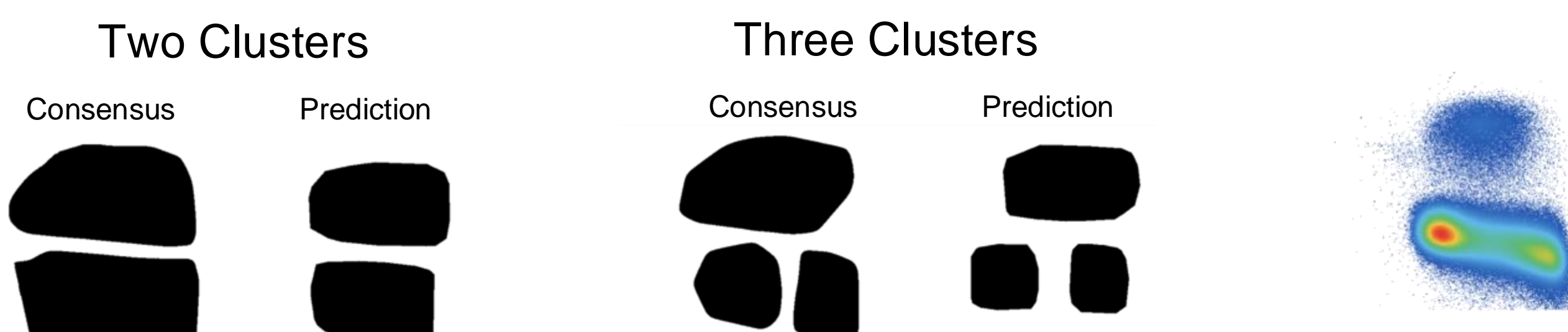
Images	BIRCH	GMMs	KMEANS	Pix2Pix
Image 1	0.853	0.842	0.824	0.414
Image 2	0.902	0.901	0.899	0.146
Image 3	0.932	0.832	0.834	0.253

Table 1: Evaluation of the three clustering algorithms using DICE as the metric

Images	BIRCH	GMMs	KMEANS	Pix2Pix
Image 1	0.744	0.842	0.824	0.261
Image 2	0.902	0.727	0.700	0.079
Image 3	0.872	0.854	0.808	0.145

Table 2: Evaluation of the three clustering algorithms using Intersection over Union as the metric

U-Net (CNN) Model Results



The U-Net model was able to imitate human behaviour that it saw when training on the consensus player data. It surpasses the performance of classical clustering models and better fits to human performance especially in its ability to capture the overlap of the clusters. This result shows that there is something different that is being learned and done by humans that classical clustering models cannot achieve. Additionally, it shows that there is signal that can be captured across human behaviour to be utilized in training models for similar perceptual tasks.

Borderlands Science Automated: Video Game Players Teach AI to Align Genetic Sequences

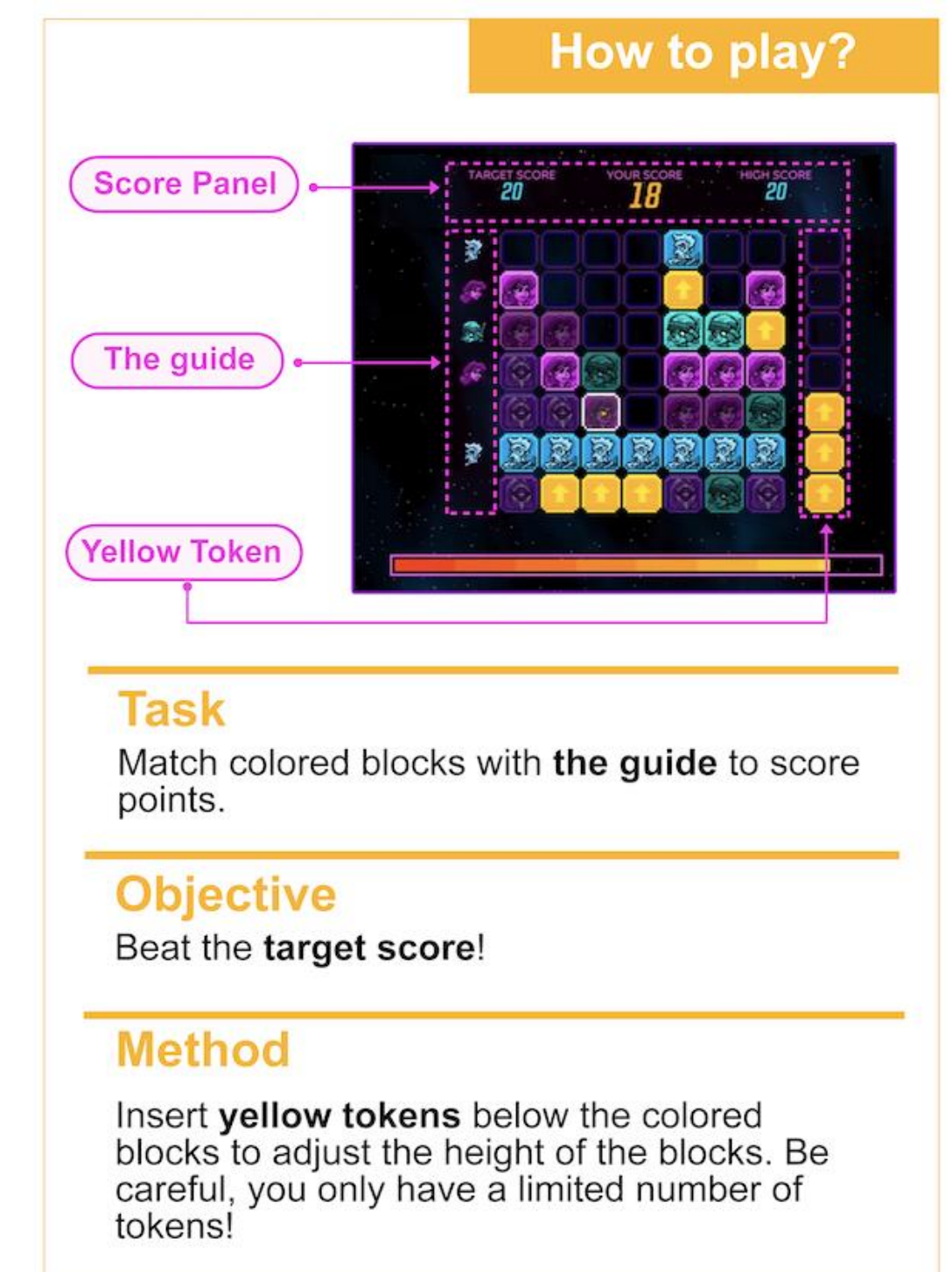
? Can we use gameplay-inspired logic from Borderlands Science to develop AI agents capable of producing high-quality multiple sequence alignments (MSAs)?

HAVE YOU EVER NOTICED that some people are very good at digesting certain food and some are not?

The human body struggles to digest fibers and complex carbs, but gut bacteria handle it for us! Without the right microbes, digestion suffers, leading to issues like inflammation, diabetes, or obesity.

From the gut to the game!

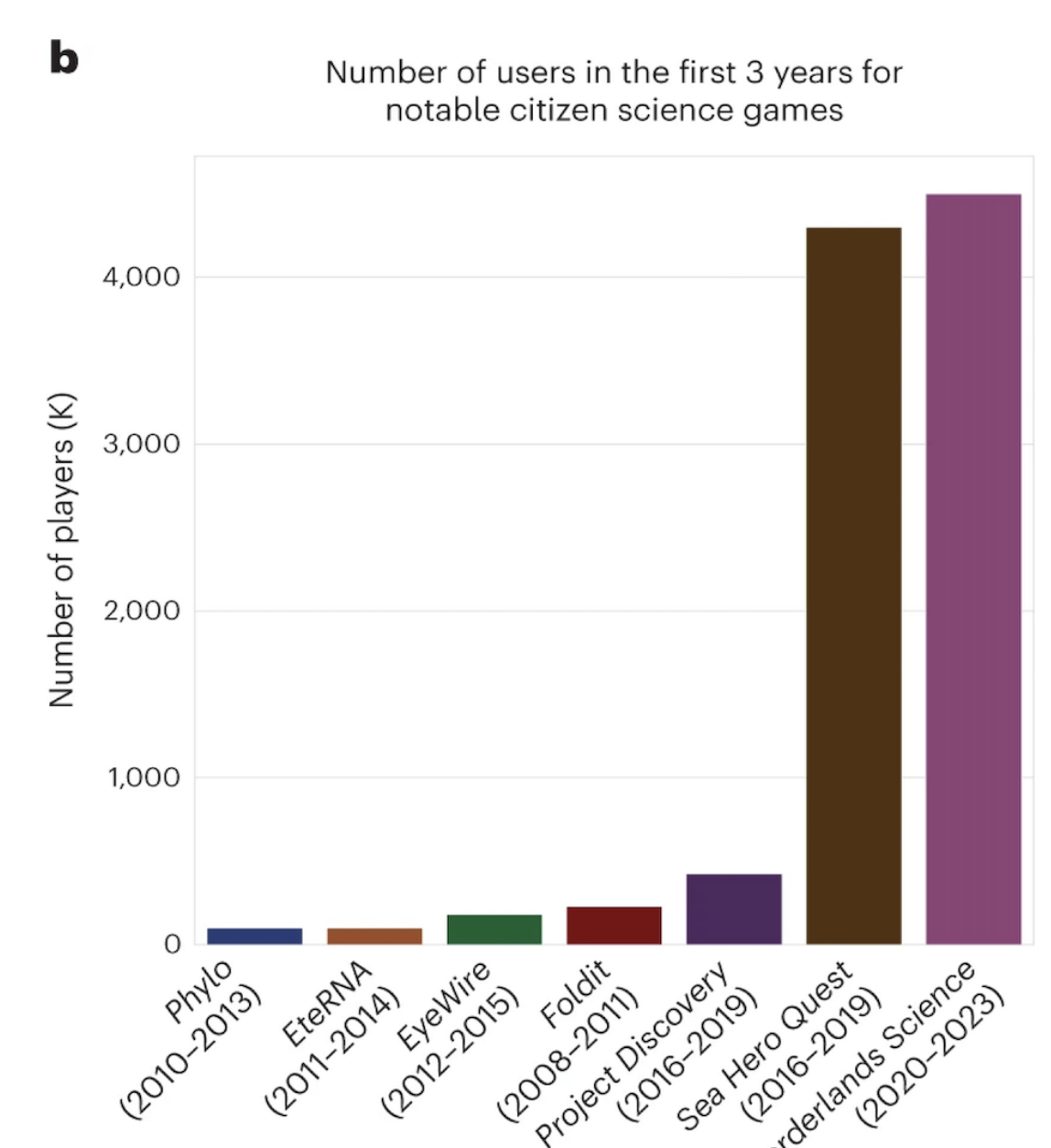
The Microsetta Initiative collects stool samples from thousands of participants, and extracts bacterial DNA from it. Next, the bacterial genomes are aligned using computational models. This is a difficult and error-prone process. Thankfully, humans can help correct these errors by playing Borderlands Science!



Released in April 2020, Borderlands Science is a mini-game within Borderlands 3 in which players solve puzzles in a virtual arcade booth located within the game's universe. Isn't this fun?!

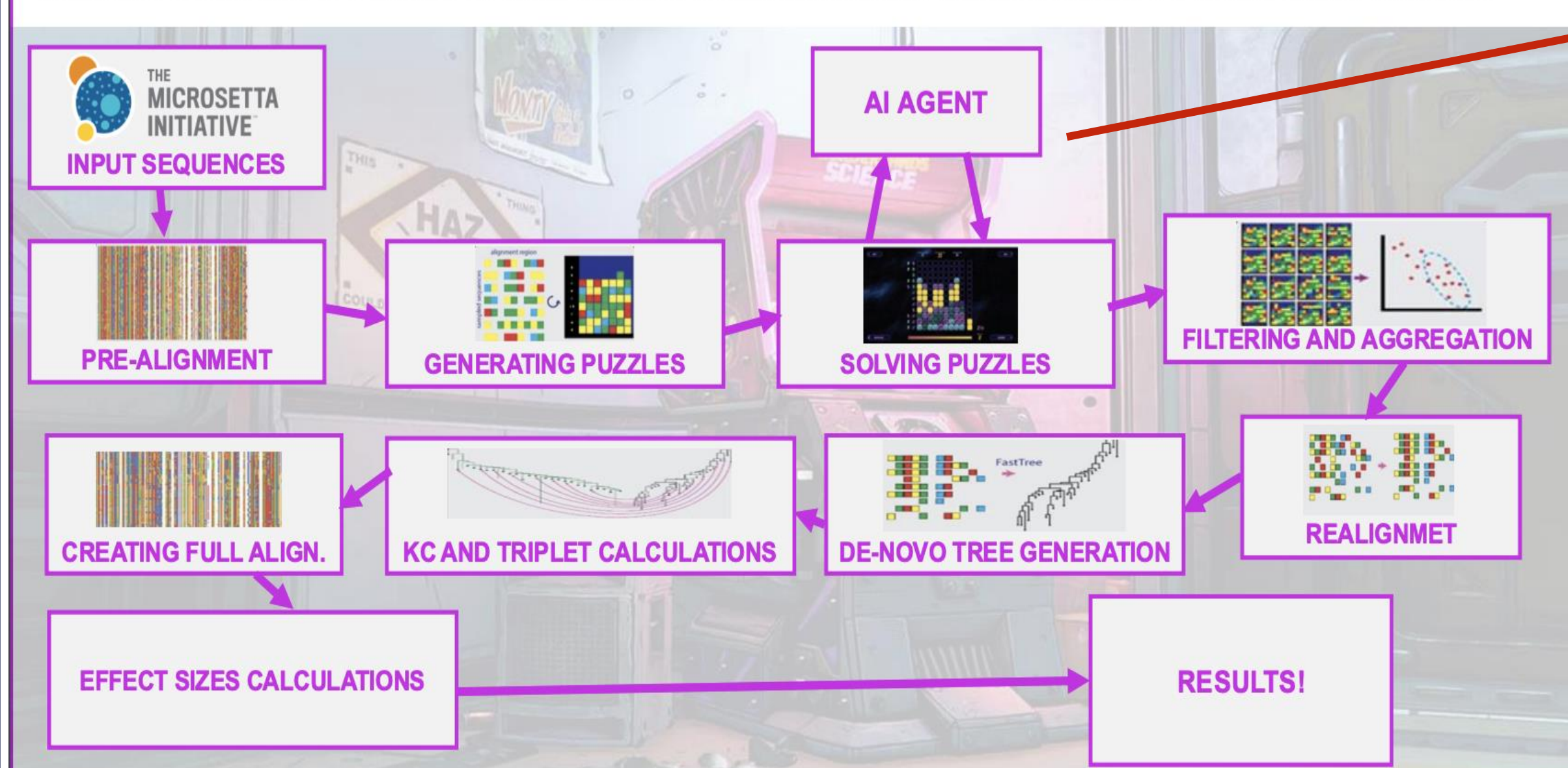


By aligning the colored blocks in the game and trying to get the highest score, players are actually aligning gut microbe DNA and helping to identify their functions!



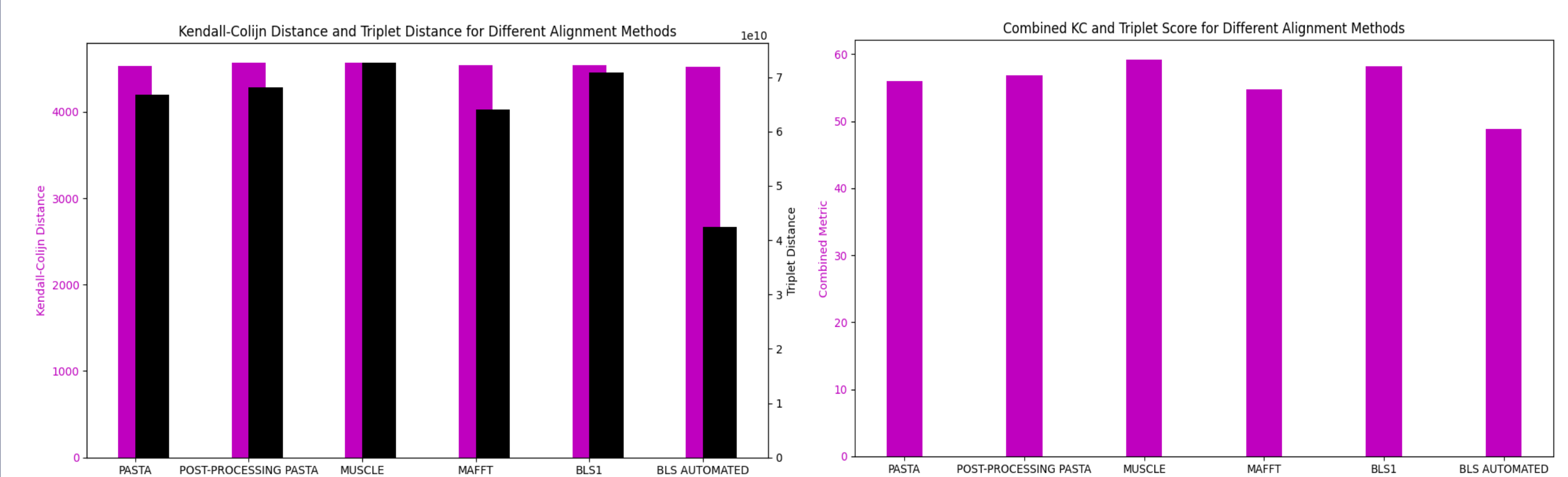
PIPELINE, NOW AUTOMATED!

Below is the pipeline used in Borderlands Science. As our next step, we are aiming to use the AI that we trained on the players to automate the use of the pipeline. This will allow us to increase the quality of previous experiments, as well as enabling the pipeline to solve MSA on new sequences!



We have trained our AI agent on the highest quality solutions from the game!

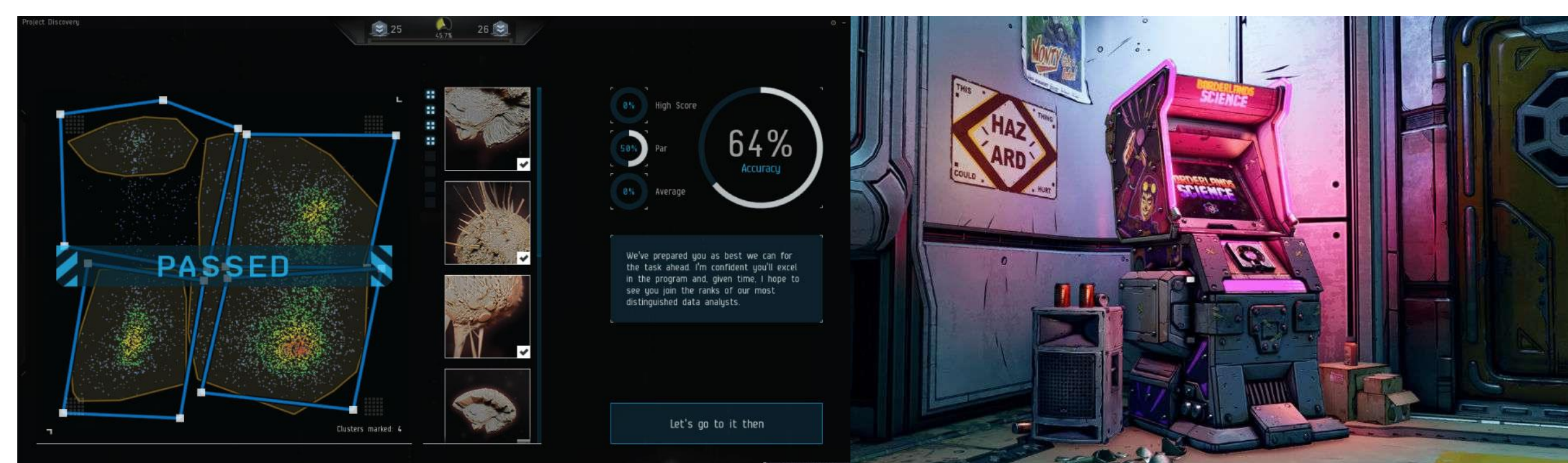
Results: Our automated pipeline using the AI agent trained on high-quality player solutions from Borderlands Science beats the performance of Borderlands Science players and state-of-the-art alignment algorithms on the Borderlands Science dataset.



A new citizen science paradigm!

Borderlands Science and Eve Online (or Project Discovery) demonstrate the potential of embedding scientific discovery games within popular commercial titles. Pre-existing player bases unlock new opportunities, with **millions of players**, problems that were previously unsolvable can now become viable research targets through citizen science!

In 4 years, over 4 million players have submitted over 120 million solutions to more than a million puzzles. This amounts to more than 700 work-years!



Our mission:

We develop new ways to use popular games to solve scientific problems and make valuable research progress. The video game of tomorrow becomes a responsible way to participate in resolving scientific and social problems. They connect and build trust of society in science and game industry.

