# Strategy Card Game Al

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## Legends of Code and Magic



LegendsOfCodeAndMagic.com

## Legends of Code and Magic 1.2



#### Draft Phase Arena mode

**Battle Phase** 

LegendsOfCodeAndMagic.com

## Legends of Code and Magic 1.5

AP	Creatures: 11   Green Items: 7   Red Items: 5   Blue Items: 7   0 1 2 3 4 5   0 1 2 3 4 5		
Default		LegendsOfCodeAndMagic	
Cards: 30			
LegendsOfCodeAndMagic	Creatures: 16 Green Items: 6 Red Items: 4 Blue Items: 4 0 1 2 3 4 5 6 7+	LegendsOfCodeAndMagic	

#### Deckbuilding Phase Constructed mode

**Battle Phase** 

- Deckbuilding (Constructed mode)
- Procedurally generated cardsets
- new "Area of Effect" keyword for creature and item cards

## Competitions

One lane version (LOCM 1.0) Jul 2018 – CodinGame Sprint Contest (24h) – 742 participants Sep 2018 – CodinGame Marathon (30 days) – 2,174 participants

Two lanes version (LOCM 1.2) CEC 2019 – 6 entries (+2 baselines) COG 2019 – 9 entries (+2 baselines) CEC 2020 – 3 new entries (+10 previous agents) COG 2020 – 1 entry + 3 CEC entries (+2 baselines) CEC 2021 – no new entries COG 2021 – 5 new entries

Constructed version (LOCM 1.5) COG 2022 – 6 new entries

Multiple entries uses <u>gym-locm</u>: OpenAI Gym environment for LOCM created by Ronaldo Vieira, Anderson Rocha Tavares, and Luiz Chaimowicz

## **New Entries**

ByteRL, by Wei Xi, Yongxin Zhang, Fuming Wang, Haowei Liang, Peng Sun, Python Single agent solution. Policies for both phases learned end-to-end via Fictitious Self-Play and Deep Reinforcement Learning. Training done with the author's proprietary RL framework (planned to be released as open-source).

**Inspirai**, by Rujie Zhong, Junran Xie, Wenjie Pang, Python Score function (based on Coac player) for deck construction. Self-play NN training using PPO.



#### MugenSlayerAttackOnDuraraBallV3, by Athar, Zu Hyun, Mohamed, Python

Only uses "area" cards. Partially predefined playing strategy (spells/creatures ordering and targeting). Statistic-based card scoring system with self-made weights.

## **New Entries**



#### **NeteaseOPD**

Jianming Gao, Yunkun Li, Yali Shangguan, Zhaohao Liang (Netease Game OPD), Python PPO and self-play to train policies for both phases. The authors updated gym environment to LOCM version 1.5.

#### **USTC gogogo**

Lu YuDong, Zhao Jian (University of Science and Technology of China), Python Two bots submitted: after preliminary games, better used for the final competition. Hyperparameters for the card selection phase, playing phase based on RL model.

Zylo, by Daniel Górski, Java

Heuristic-based search with random move sampling. Evolutionary algorithm for parameter tuning.

## **Results**



## Results

Place 🦨	Player	Wins
1	ByteRL	84.41%
2	NeteaseOPD	75.00%
3	Inspirai	67.57%
4	MugenSlayerAttackOnDuraraBallV3	42.04%
5	USTC-gogogo (Zero_control)	41.09%
6	Zylo	38.60%
7	RandomWItems2lanes	1.29%

Detailed results, game statistics, and player data available at <u>github.com/acatai/Strategy-Card-Game-Al-Competition</u>







## **Bonus 1.2 Run: Results**

Place	Player	Wins
1	ByteRL	94.56%
2	DrainPowerAggressive	73.64%
3	DrainPower	73.53%
4	Coac	68.23%
5	Chad	67.90%
6	OneLanelsEnough	54.80%
7	ReinforcedGreediness	51.31%
8	LANE_1_0	34.57%
9	Baseline1	21.95%
10	Baseline2	20.82%
11	AdvancedAvocadoAgent	20.76%
12	Ag2O	17.94%



## **The Winner**



### ByteRL by Wei Xi, Yongxin Zhang, Fuming Wang, Haowei Liang, Peng Sun (double champion for LOCM 1.5 and LOCM 1.2)

Congratulations!!!

Second place: **NeteaseOPD** Third place: **OneLaneIsEnough**