

Data

Assumptions

• Pokémon: game franchise where players battle with teams of fantasy creatures

- Complex rock-paper-scissors-etc style elemental types give advantage and disadvantage
- Speed, attack, defense, type advantage, hit points, status effects, move sets, etc. for each Pokémon
- Teams of up to six
- Elements of strategy show up via team order, team type, team stat composition, and multi-team strategies
- Elements of luck from the battle equation which involves RNG for damage and critical hit calculations
- The Elite Four are one of the final challenges for a player
 - A sequence of four teams to beat and become the Pokémon Champion

When we last left our heroes...

• Previous model only handled 1v1 battles at level 1, and did not track any time component

Mechanics

Assumptions

Problem statement

• How can we most efficiently beat the Elite Four's teams of five Pokémon?

Measures of performance

- Time (6 seconds per round of actions)
- Player's team must survive the gauntlet of all four teams sequentially (20 total opposing Pokémon)

Data

Assumptions

Elite Four Composition

- Lorelei (Water/Ice type)
 - Dewgong, Cloyster, Slowbro, Jynx, Lapras
- Bruno (Rock/Fighting type)
 - Onix, Hitmonlee, Hitmonchan, Onix, Machamp
- Agatha (Poison/Ghost type)
 - Gengar, Golbat, Haunter, Arbok, Gengar
- Lance (Dragon type)
 - Gyarados, Dragonair, Dragonair, Aerodactyl, Dragonite









Background

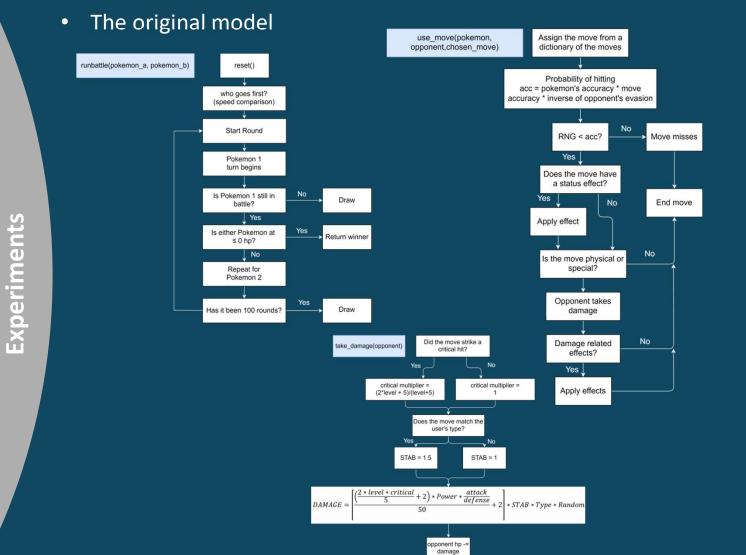
Data

Constraints, Limitations, Assumptions

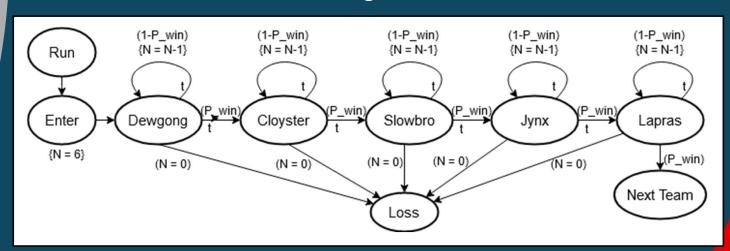
- Only Pokémon from Generation 1
- All Pokémon now at Level 50
- Base stats used (ignored IV and EV values)
- Moves are randomly picked from all available moves for each Pokémon (to reduce modeler bias)
- Full video game battle/damage equation is modeled
- PP (move use limits) are ignored, no switching, no items
- Testing all 11,853,911,588,401 team combinations repeatedly is computationally expensive
 - Testing a subset of teams will provide data to make further decisions
- Full health reset between the Elite's teams
- Sourced data includes the stats for each Pokémon, equations from the video games, and Generation 1 Elite Four composition
- Experiment of 1,000 attempts per player team against the full gauntlet of the Elite Four

- All the data and equations are available readily on sites like Bulbapedia and Serebii, with the collected data files on Kaggle
- This data was folded into our model to govern the behavior of every entity and their attacks and interactions
- This original, bespoke, high-fidelity model provided us the inputs for the new model

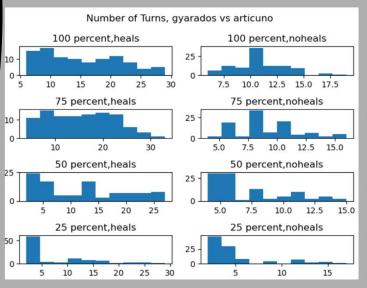
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			9 Bu	lbasaur	41 Sleep Po	ow Grass	-		75%	15							
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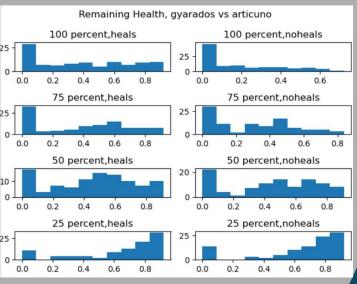


- The new model pits pairs of Pokémon against each otherin turnbased combat until a winner is determined (batch arrivals, turn based serving)
- When a Pokémon is knocked out, the next member of the respective team is entered into combat (FIFO server and customer)
- Whichever team has surviving Pokémon at the end of the battle is declared the winner
- If the player's team is victorious, they are returned to full health and pitted against the team of the next member of the Elite Four (sequential queues)
- All the while, the timer is running



- Initial tests were conducted to seek distributions for the Simio model
- Every pairing of Pokémon returned different data sets with numerous distributions depending on initial conditions and availability of health resets
- Every fitted distribution was fidelity lost, and complexity added to the Simio model
- Python was chosen to ultimately run our simulation





Experiments

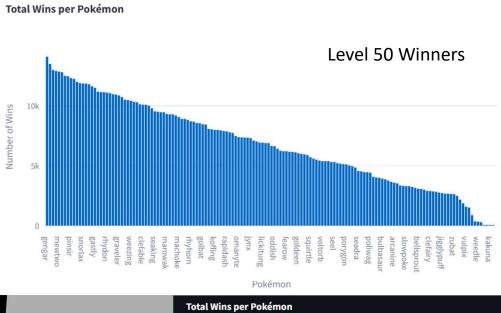
Data

Mechanics



Data

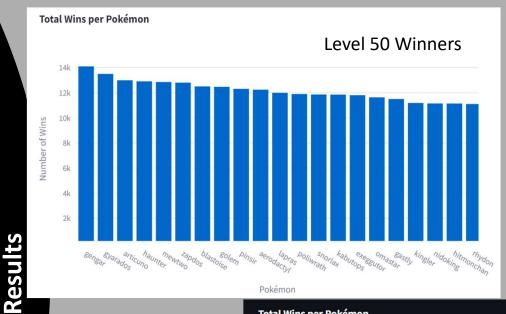
Experiments



Results

The initial testing showed different winners at level 50 than we had at level 1, with the advent of new and more powerful attacks being available to our competitors





Top winners

- The top six here becameTeam 7
- Gengar moves from rank 15 to rank 1

Experiments

Mechanics

Data



- 11 teams were chosen for various reasons: previous winners, high hp, high win rate, type advantage, nostalgia, etc.
- Every team was run in forward and reverse against the full gauntlet of the Elite Four
- These attempts were repeated 1,000 times to find the long-term average speed of the successes

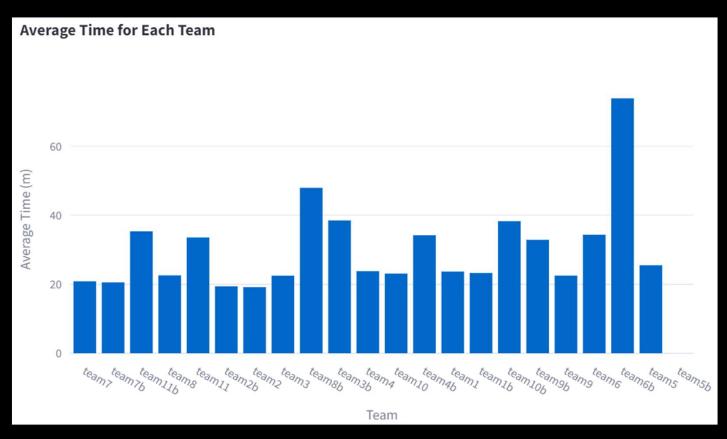
Team Number	Position 1	Position 2	Position 3	Position 4	Position 5	Position 6
1	Gyarados	Gyarados	Gyarados	Gyarados	Gyarados	Gyarados
2	Gengar	Gengar	Gengar	Gengar	Gengar	Gengar
3	Articuno	Zapdos	Mewtwo	Blastoise	Mew	Moltres
4	Gengar	Poliwrath	Magneton	Dragonite	Charizard	Alakazam
5	Poliwrath	Himonchan	Machamp	Machamp	Primeape	Hitmonlee
6	Mewtwo	Snorlax	Muk	Vaporeon	Wigglytuff	Chansey
7	Gengar	Gyarados	Articuno	Haunter	Zapdos	Mewtwo
8	Gengar	Articuno	Mewtwo	Exeggcutor	Clefable	Vaporeon
9	Articuno	Zapdos	Moltres	Dodrio	Farfetch'd	Pidgeot
10	Gengar	Lapras	Rhydon	Venusaur	Onix	Growlithe
11	Exeggutor	Gengar	Vaporeon	Clefable	Mewtwo	Articuno

Experiments

Data

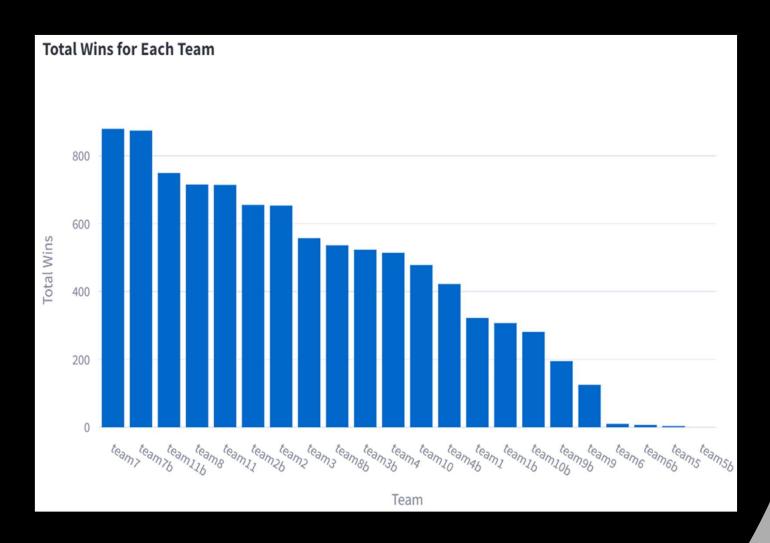
Mechanics

- Of the 11 teams we tested, the fastest team was a little unclear at first
- Multiple teams could win in under 25 minutes, when they won
- Others couldn't win at all, regardless of time



Mechanics

• It became much clearer when we involved the win rate as well



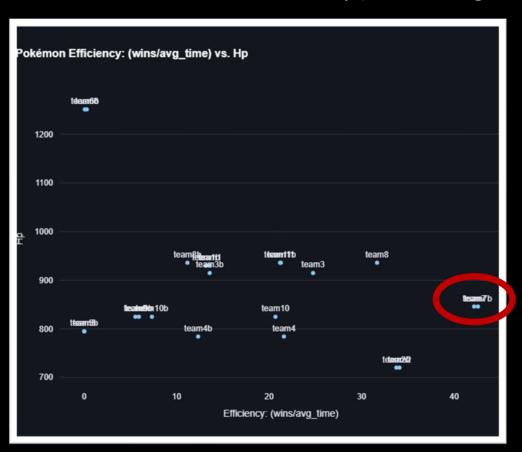
Experiments

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- The fastest team with the highest win rate was team 7
 - Under 21 minutes (<210 actions)
 - Averaging less than 11 attacks per opponent Pokémon
 - 87.9% win rate
- Gengar, Gyarados, Articuno, Haunter, Zapdos, and Mewtwo should run point on our invasion force against the Elite Four



Pokémon Total Team Health vs Efficiency (wins/average time)

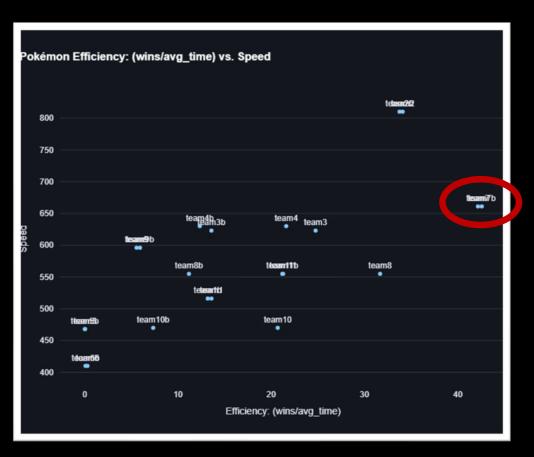


Not a strong positive correlation between Health and Efficiency

Experiments

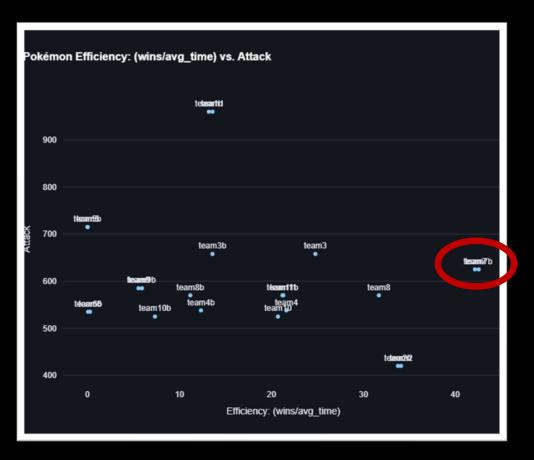
Mechanics

Pokémon Total Team Speed vs Efficiency (wins/average time)



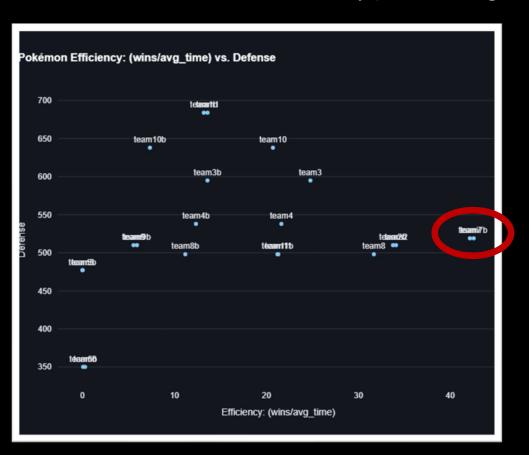
 Noticeable strong positive correlation between Speed and Efficiency

Pokémon Total Team Attack vs Efficiency (wins/average time)



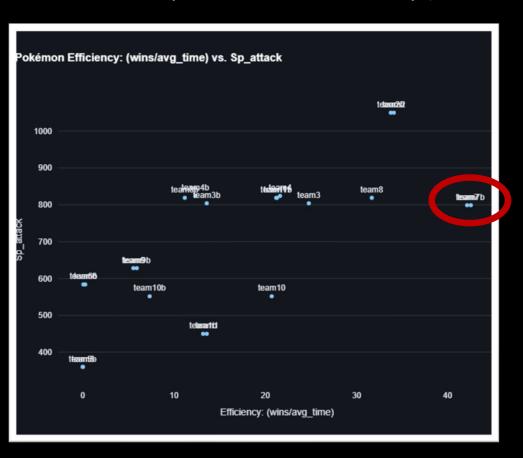
Little correlation between Attack and Efficiency

Pokémon Total Team Defense vs Efficiency (wins/average time)



• Weak positive correlation between Health and Efficiency

Pokémon Total Team Special Attack vs Efficiency (wins/average time)



 Noticeable strong positive correlation between Special Attack and Efficiency

Pokémon Total Team Special Defense vs Efficiency (wins/average time)



• Weak positive correlation between Special Defense and Efficiency

Conclusions:

- Invest in teams with high speed and special attack stats
- Most teams' orders do not result in significant performance change
- Some models are best performed with Python instead of Simio
- Gengar, Gyarados, Articuno, Haunter, Zapdos, and Mewtwo should run point on our invasion force against the Elite Four
 - Under 21 minutes (<210 actions)
 - 87.9% win rate
 - Highest individual win rates



Results

- Find a team that beats Agatha even more consistently
- Repeat experiment at Level 100
- Add move limits (PP)
- Allow item usage
- Allow for move selection input
 - Compare available moves for each Pokémon
 - Do moves affect outcome more than stats?
- Train an AI for each Pokémon to handle the move inputs
- Test all 11,853,911,588,401 possible combinations





Further Research

Results

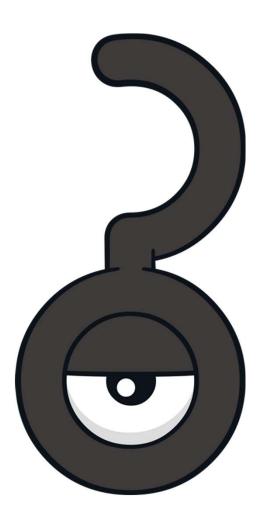
Streamlit App



Further Research

Results

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Questions

Further Research Results

Appendix Slides

Generation I

$$Damage = \left(rac{\left(rac{2 imes Level imes Critical}{5} + 2
ight) imes Power imes A/D}{50} + 2
ight) imes STAB imes Type1 imes Type2 imes random$$

Generations I and II

$$\begin{aligned} \text{HP} &= \left\lfloor \frac{\left(\left(\text{Base} + \text{DV} \right) \times 2 + \left\lfloor \frac{\left\lceil \sqrt{\text{STATEXP}} \right\rceil}{4} \right\rfloor \right) \times \text{Level}}{100} \right\rfloor + \text{Level} + 10 \\ \text{OtherStat} &= \left\lfloor \frac{\left(\left(\text{Base} + \text{DV} \right) \times 2 + \left\lfloor \frac{\left\lceil \sqrt{\text{STATEXP}} \right\rceil}{4} \right\rfloor \right) \times \text{Level}}{100} \right\rfloor + 5 \end{aligned}$$

For leveling up the Pokémon, we set DV and STATEXP t = 0. These are values dependent on the Pokémon and how many prior battles it has undergone.