## Predicting MOBA Balance Outcomes

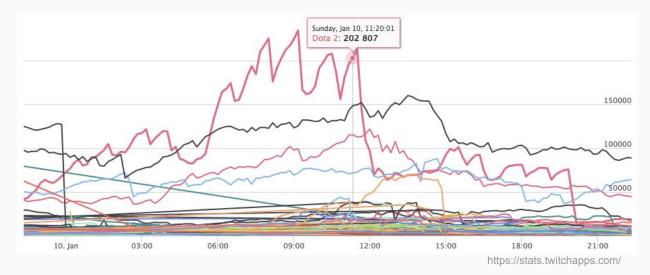
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Galvanize, 1/14/16



## What's a MOBA?

- The most-played and most-viewed genre in eSports
- Market leaders are League of Legends and Dota 2



## What's a MOBA?

- Typically 5v5 team PC games where players cooperate to tackle objectives
- For each game, each team bans 5 characters and selects 5 characters
- Characters are chosen according to perceived strength and synergy
- Periodic "Balance Patches" are released to address strength disparities



#### GAMEPLAY UPDATE 6.86

#### GENERAL

- Added Arcane Rune
  - + Show details
- · Creep bounty increases by 1 gold per normal upgrade cycle [?]
- Siege damage against heroes increased from 75% to 85% [?]
- Hero base HP increased from 150 to 180
- · Creeps now arrive slightly closer to the top dire tower and bottom Radiant tower
- · Random Draft hero pool increased from 24 to 50
- · Added Random Draft to Ranked Matchmaking
- · Random Draft now uses the same picking mechanics as Ranked All Pick

## Core research question

#### Can I predict the effect of a balance patch on professional play?

	P+B %	WIN%	LOSE	WIN	BAN	PICK	P+B	HERO
	98.5	56	33	43	392	76	468	- Com
	97.4	51	125	132	206	257	463	E L
	93.2	56	73	95	275	168	443	-
	90.9	44	117	94	221	211	432	*
	87.3	51	76	81	258	157	415	
<b>^</b> 1	87.3	55	97	120	198	217	415	THE STATE OF
	84.6	51	115	123	164	238	402	Treat .
	80.8	50	112	115	157	227	384	133
▲1	79.7	53	101	114	164	215	379	
▲1	65.8	52	56	63	194	119	313	
▲1	63.3	52	31	34	236	65	301	



HERO	P+B	PICK	BAN	WIN	LOSE	WIN%	P+B %	
	405	215	190	107	108	49	91.0	
	389	224	165	116	108	51	87.4	
	346	138	208	74	64	53	77.7	
	343	202	141	107	95	52	77.0	▲1
13	322	199	123	105	94	52	72.3	
	313	124	189	63	61	50	70.3	
	301	68	233	37	31	54	67.6	

Patch 6.85 Patch 6.86

## Data sourcing

# $\delta$ atdota

#### Historical data for professional games

- hero pick/ban%
- hero win rates
- same-team hero pairings
- hero head-to-head performances



#### Hero and patch information

- raw text of patch notes
- hero roles

#### **NLP of Patch Notes**



- Over the past 10 patches, there have been about 1200 hero changes
- I labeled 100 as positive or negative and predicted the rest with boosting

#### **Challenges:**

- Language used in writing patch notes has changed since 2012
- "Increased" is not always positive; "Reduced" is not always negative
- Many changes are numerical and not caught by NLP

### Hero interactions

 Unchanged Heroes can still benefit significantly from improvements to synergistic partners IO TINY

 Similarly, Heroes can benefit or suffer from changes to their "counterpicks"

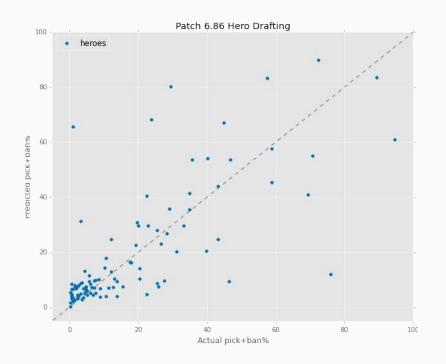


## Modeling

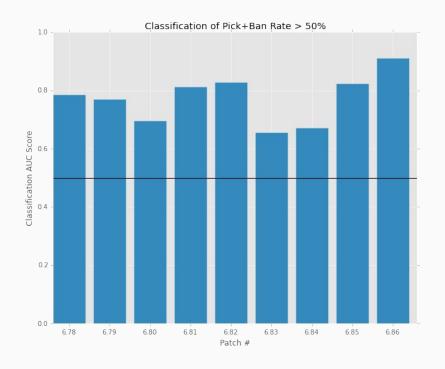
- Target: post-patch pick+ban rate (%) in competitive games
- Core features:
  - previous popularity and performance
  - probability that changes made to hero will improve hero (from NLP)
  - o composite measure of +/- change to hero's common pairings
  - composite measure of +/- change to hero's common opponents
- Models: Gradient Boosting Regressor, Gradient Boosting Classifier
- Classification problem: identify heroes with > 50% pick+ban rate

#### **Model Results**

#### Regression

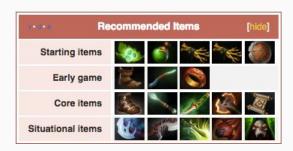


#### Classification



## Next steps

Hero-item interactions (another round of NLP!)



- Scrape/NLP player attitudes to identify untapped potential in advance
- Explore other use cases

## Thank you!

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