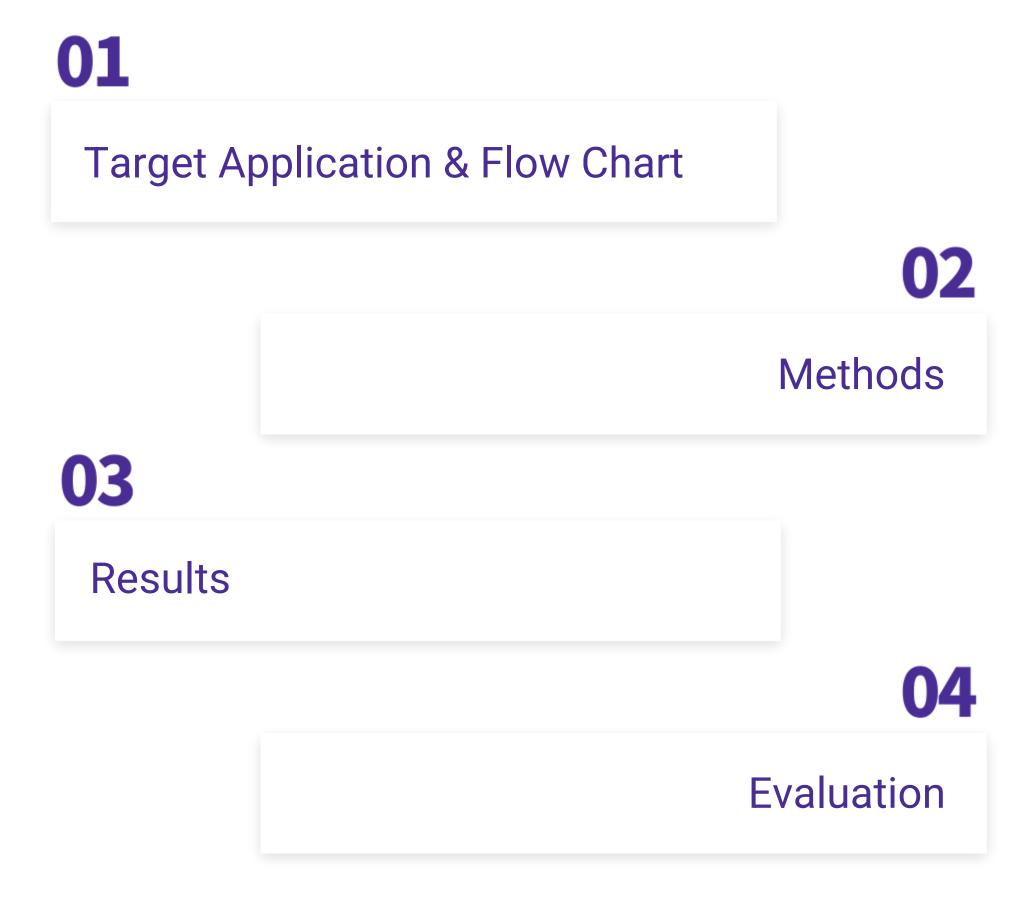
League of Legends Champion Recommendation

INDEX



Target Application & Flow Chart

Target Application

Which of the 161 champions would be the best to choose?



<Goal>

Advanced champion recommendation application by analyzing game records Recommend how to manage a game based on statistics

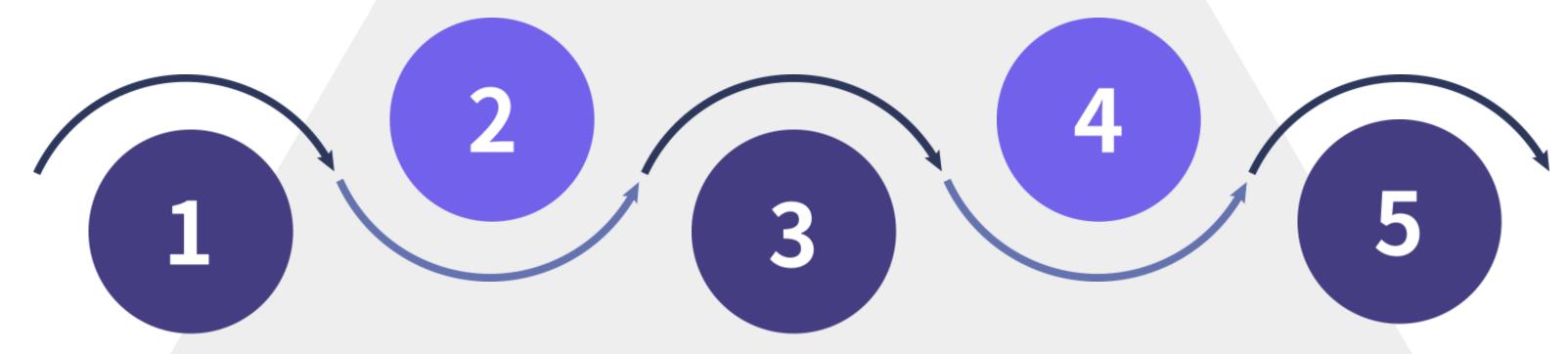
Flow Chart

Find Best Champion

Use Association rules and A-priori algorithm to find the champion with the highest winning percentage

Dimension Reduction & Clustering

Reduce dimension of the game record data and do clustering



Crawling & Scrapping

Crawl and Scrap game records from op.gg + refine data

Game Record Filtering

Filter the game records with the selected champion

Tells Recommendation

Tells user what champion is the best pick and how to steer the game

Methods

Data Preparation - Crawling & Refining

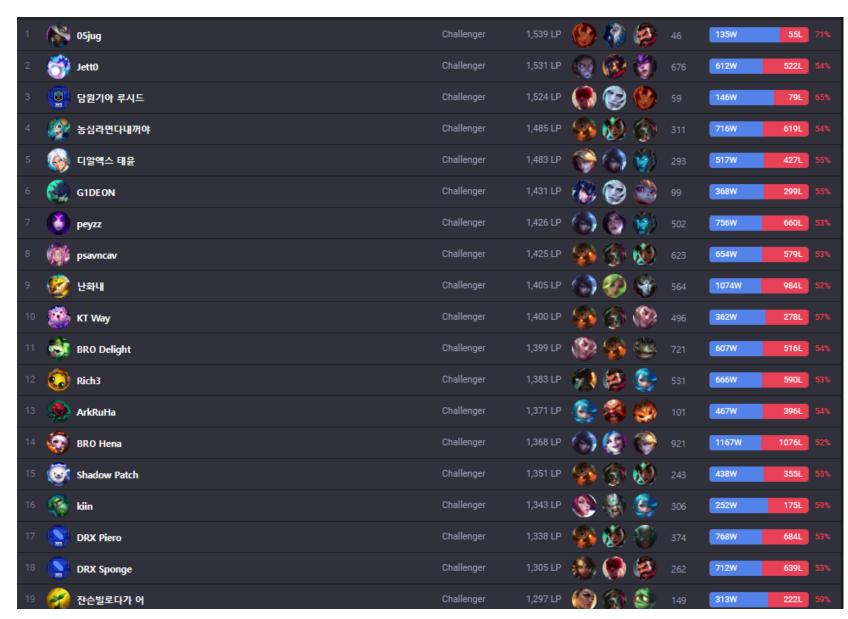
Tool for crawling : Selenium



Crawling site: OP.GG



Data Preparation - Crawling & Refining

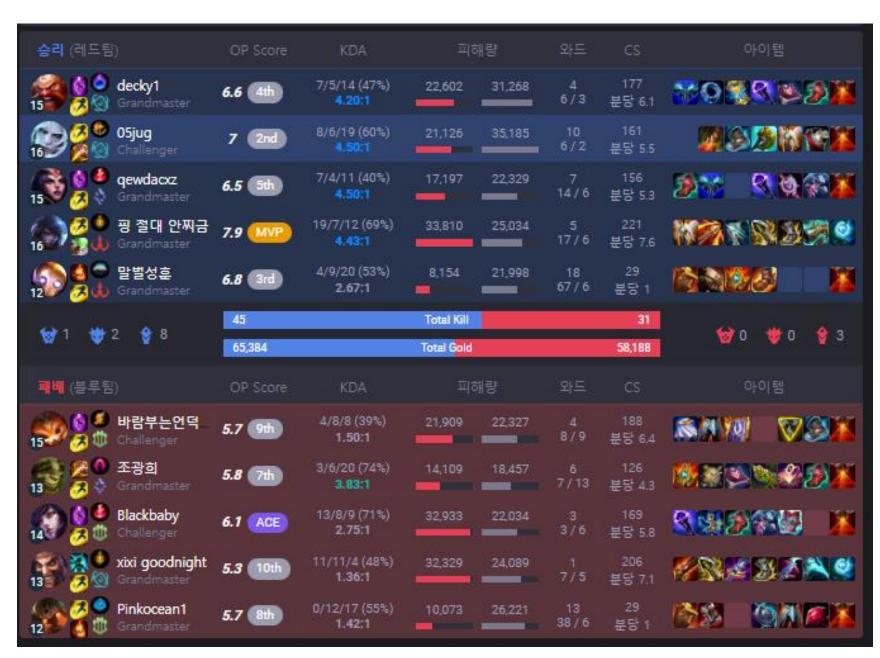


SoleRank top 1000 users

['chancedong', 'contactus', '징징문', '다없수질', '시간의숲', 'shadow1234', '내가대격변이다', 'suyiming', '신을저주해', 'blackbaby', '망니 니박진수', 'nssylvie', 'lumingze', 'ktway', 'luckgame1', '이렐아칼리', 'brohena', '재훈이의모함', 'quad', '아아스크림', '추텋이fan', 'sup eme01', 'qingqingqing', 'freditbrion', '어디간거니', '냥똥벌레', 'lajifuzhu', '독소쌓인다', 'dksharvel', '칼과창방패', '권지인', 'needhe r', 'dklucid', '농심라면다내꺼야', 'hlesamd0', '하건둘리', 'radiohead', '바람부는언덕위메', '디알엑스태윤', '연애꽃1', 'arkruha', 'fa피 치', 'honpi', 'shadownia', 'xbm', '존중겸손아닥집중', 'brodelight', '해가지면달이핀다', 'drxsponge', 'brobro', 'ktamid', 'rascal', 'psavno av', 'shadow1111', '범고래사자고양이', 'ningyao', '이차가식기전에', 'twitchtvmigung', 'illm6e8a', '또한방울', '청포도육포', '은가뉴', 'tpz hao727472857', 'drxpiero', '어리고싶다', 'beichuan', 'qfddxs', '해야하는것들', '코태', 'kiin', 'rich3', '변정현굉장하다', '어디가다들', 'g 1deon', '착하게채팅쳐요', '난화내', '호잇이', 'pengyouwanan', '어쩌라고맞짱뜰까', '일산전영찬', '담원패밀리', '언니우기', '4ywioi1zi6kb0', 'shadowpatch', 'p9q6p9q', 'rewkfopdsfk', 'ktcastle', 't1smash1', '변변점정현현', '221124', 'ktvicla', 'wjatnsupup', '화내기도지쳤어', '06 탑차이', '대머리', 'dkpullbae', 'lcklpl', '쟌슨빌로다가어', '아이러니', 'pangsu', 'hhhhbbbb', '그땐그저좋았다', '해피람', 'indexy', '동냥 아치', 'igymg', '워드', 'ucal', '핏빛계약', '맛있어져라', 'dk세인트', '캐인', '도구는툴툴', '기묘기묘', '개게알러지', '마틴마틴마틴마틴' 'permaban12061827', 'x1ng', '해피윰', 'slowshiba64', '분과', '이해가아리마셍', 'revebonheurtoi', '소년가장원딯', '유상증자', '눈을사용하세 요', '캐리나할까', 't1photon2', 'azhy', 't1gumayusi', 'kqher', '6461', 'talon817', 'qweqweqwerrr', '먹무링', '아창란식물', 'dkbible1', '케 ·리움', 'smallchamppool', '방송인손주녁', '렐서폿', '런두', 'onelastkiss', '신상공원', '저맹굽니다', 'facalime', 'gengakia', 'midking', '누 쇤팍', 'fgdkxcnkz', 'academyt1', 'bromorgan', '관모', '매일불면증', '원나물', 'nekol', 'cOldworld', '게으름피우기', '에너지듀링크', 'inng 7', '박구원', '이니쉬', 'zenbukorosu', 'pzzzang', '우연이영원히', '쌔di', 'castIng', '테디park', '아좀맛없네', '김춘식', '초보강아지', '피 그차이나', 'maybealittle', 'icnoasndql', 't1trigger', 'erilia', 'zika1', '애디도구른다', '실수없이', 't1포레스트', '수희0', '내목숨은아이 어메', '코로나시러', 'letmesup', 'baut2', 'new상민', 'hxqeyff', '한화생명기몽조', 'rumbon', 'sangchu', '쭌베', 'ddoobb', 'shenmigaoshou', 'ddoiv', '버기해적단버기', 'onezang', '울부짖는마오카이', '초바모자', '팀개못하면누누함', '강하다별', 't1gangplankzz', 'yoyodear', '젠지이 - 케아', '청포도는외계인', '이기고싶다아', '경자고김우민', '빙산의일각', '손주녁', 'romeosaveme', 'jkjkjkjkk', '비급음식서바이벌', 'luckgame 3', '술인데요', '찡찡찡찡찡징찡', 'mudai', '준승이', 'zhouyudagougou', '야이야이야이야', '정글도치', '정훈이의모험', 'wehui', 'midqvq', 'fortunateman', '전민혁', '프로연락친추주셍', 'rebysr', '타코먹으러떠남', 'kp스타수혜자', '드래곤볼온라인', 'xwopxi', 'esenswtfru', '매니 속예쁜미친년', '나는냉정하다', '아라가키유이', '조고마한달기', '하하하하이새끼', 'twitch다훈갓', '노력35', 'fatty', '쏘쏘꼬미', 'noir5', 'uneasy123', '초음파발아랏oooo', '가오띵띵', '백크님화이팅', 'new윤환', 'yibeiliangbei', '아이러니2', 'Ingzhaorenxxxxx', '번갯불의섬광', '저빵인데터졌어영', '곽수종', '아연몬', '신격', '불이과', 'dayeking', '댕청한남자', '강직한루비임프', '슈퍼짱세이', '이겨보자아', '98kch' 'permaban12061826', 'seven', '공주현s2', 'ilililil23', 'hleonfleek', 'qa23c44333', 'dkshowmaker', '열심히가안돼요', '밀리마스', 'tsmftxmi a', 'kimsanghoon', 'destiny', '한달안메챌까지', '행복한태윤이', 'avrillavlgne', 'gengcasting', 'vancouver0', '전설의롤1234', '블미', 'jul 7', 'asdfghjhhg', '킬러톱', 'wittmid', 'nulinuliba', '광연44', 'ouyangnanathebe', '강주연', 'dankeshcon', '거북이삼형제', 'zxcawaqwe', 'dd ayman', 'orcachu', '겨울레몬', 'rdyrdy', 'imanostrich', '이야공', 'Isbenvy', '꿀잼사과잼', 'saebyuck', 'neth3rworld', 'iieona', 'fragiie', 'topking', '이쁜채팅', 'zzz163', 'kukukukuku', '악마돌', 'gengseeder', '진영진영', '졸린시간의숲', 'haoeeeee', 'pizano', 'afgfg', '트위치 다훈갓', 'danxiaogu', 'epilogueforyou', 'ohlovely', '토어문호두', 'knightbaby', 'twosupcantwin', 'dwgkia', 'shadowcad', 'gengruler', '고등 학생', 'beibeibabe', 'bvoy3', '찬중', 'doo2o', 'zichuanxiu', 'everysecOnd', 'permaban12064821', 't1van', 'xxiaohao', '북한가자', 'hlewille r', 'mm8n', 'milinjinbingwan', '저높은곳으로', 'blacksmithking', 'ignar', '못생김채영', '2o22winter', 'aileri', 'shangxinni', 'canbeyour', '하늘에노래하며', 'doltv5327129', 'vmuy', 'lifel', '하건펭수', 'wannaberookie', 'wampuyam', 'mrotsder', 'haohanguo', '준걸준재주재', 'qwas dasd', 'ktrjgl', '내반려견봄이', 'jaeyounge2', '전프로코치구직', 'sharvelfan1', '남장구', '아너큐돌려', 'bababaabam', '교육잘받은도구', '허빙', 'crDwn', 'qusibadaye', 'dk바이불', 'maozhuren1', 'gaohanjjoygod', 'smmz', 'nshh', 'asdoihqwhdogwd', 'thanatos', 'swalla', 'sangono m1ya', 'b109', '강하다벌', '땅우양1', 'zi존고수짱짱만', 'ths1', ''lv1'라는, '부산임기', 'iejqifpq', '의절대안이는 'haohangbe', ''vat email', '조관우급높설치', '솔랭전문서폿', '얼린레몬차', 'qweasdzxz', '별수호자김인겸', 'wocjf', '부리부리대먀앙', 'broenosh', '갈과배음 료', '벌꿀이시무', 'spongebob', '겨릴레오겨릴레이', 'z2ry', '저돌적인포지션', 'gble212', 'apology', '살퀸레', 'dangyadangyadang', 'jug200 5', '불멸의무빙', 'gwer112233', '하프물범아움아움', 'smbheixiaohu', 'hlesamd3', '건들지마심기', 'explosivecask', 't1dal', '아내를사랑하 (다', 'whysj', 'gengzest', 'hlelukalux', 'drxtaeyoonn', 'keeiyes', '정6천', 'haohao', 'pungyeon', '태리곰곰', 'imtrash', '죽기장인', '단구 동베어그릴스', 'toiand', 'vstaO', '박흥호', 'jaqbh4n', 'imaginelegends', '규보리', '짝콩이', '꾸우우우움틀', '몽키d짱구', 'daor', '7t', 't 1photon1', '디케이탑', 'cikcik', '트위치오또마', 'opensup', '서당개처럼살기', '현기증나는사람', 'jsjstar', 'beauvoyage', 'fiddlestick',

List of top 1000 users

Data Preparation - Crawling & Refining



```
"win player3": {
                           "win player2": {
                                                          "champion": "rumble",
                             "champion": "graves",
"gameType": "솔랭",
                                                          "spell1": "점화",
"win player1": {
                             "spell1": "강타",
 "champion": "fiora",
                                                          "spell2": "점멸",
                             "spell2": "점멸",
 "spell1": "점멸",
                                                          "rune1": "신비로운 유성",
                             "rune1": "감전",
 "spell2": "순간이동",
                                                          "rune2": "결의",
                             "rune2": "마법",
 "rune1": "착취의 손아귀",
                                                           "user name": "턱 발로 걷어차기"
                             "user name": "1AP 하고싶다",
 "rune2": "마법",
                                                          "kill": "5",
                             "kill": "4",
 "user name": "44224422",
                                                          "death": "5",
                             "death": "6",
 "kill": "7",
                                                          "assist": "15",
                             "assist": "11",
 "death": "6",
                                                          "kill participation": "67%",
 "assist": "5",
                             "kill participation": "50%"
                                                           "kda": 4.0,
 "kill participation": "40%",
                             "kda": 2.5,
                                                          "damage dealt": "23,363",
 "kda": 2.0,
                             "damage dealt": "18,706",
                                                           "damage taken": "21,348",
 "damage dealt": "21,678",
                             "damage taken": "27,915",
                                                           "control ward": "1",
 "damage taken": "42,893",
                             "control ward": "2",
 "control ward": "2",
                                                          "warding": "11 ",
                             "warding": "4 ",
 "warding": "9 ",
                                                           "ward removed": " 3",
                             "ward removed": " 4",
 "ward removed": " 4",
                                                           "total cs": "212",
                             "total cs": "252",
 "total cs": "206",
                                                           "cs per minute": "7.1",
 "cs per minute": "6.9",
                             "cs per minute": "8.4",
                                                          "item1": "존야의 모래시계",
 "item1": "굶주린 히드라",
                             "item1": "월식",
                                                          "item2": "신속의 장화",
 "item2": "루비 수정",
                             "item2": "요우무의 유령검",
                                                          "item3": "밤의 수확자".
 "item3": "판금 장화".
                             "item3": "최후의 속삭임",
                                                          "item4": "메자이의 영혼약탈자",
 "item4": "신성한 파괴자",
                             "item4": "광전사의 군화",
                                                          "item5": "망각의 구",
 "item5": "처형인의 대검",
                             "item5": "칠흑의 양날 도끼",
                                                          "item6": "방출의 마법봉",
 "item6": "콜필드의 전투 망치",
                             "item6": "예언자의 렌즈"
                                                           "item7": "투명 와드"
 "item7": "예언자의 렌즈"
```

100 games for each users

save as json

Association Rules & A-priori Algorithm

frequent & high winning rate → recommended



Association Rules & A-priori Algorithm

1st support threshold: 1/161 = 0.0062

2nd support threshold: 0.0048 3rd support threshold: 0.0016

Frequent Champions 161 - 62

Candidate Pairs

Frequent
Pairs
20000 → 3844

Candidate Triplets

Frequent
Triplets
2000000 → 5836

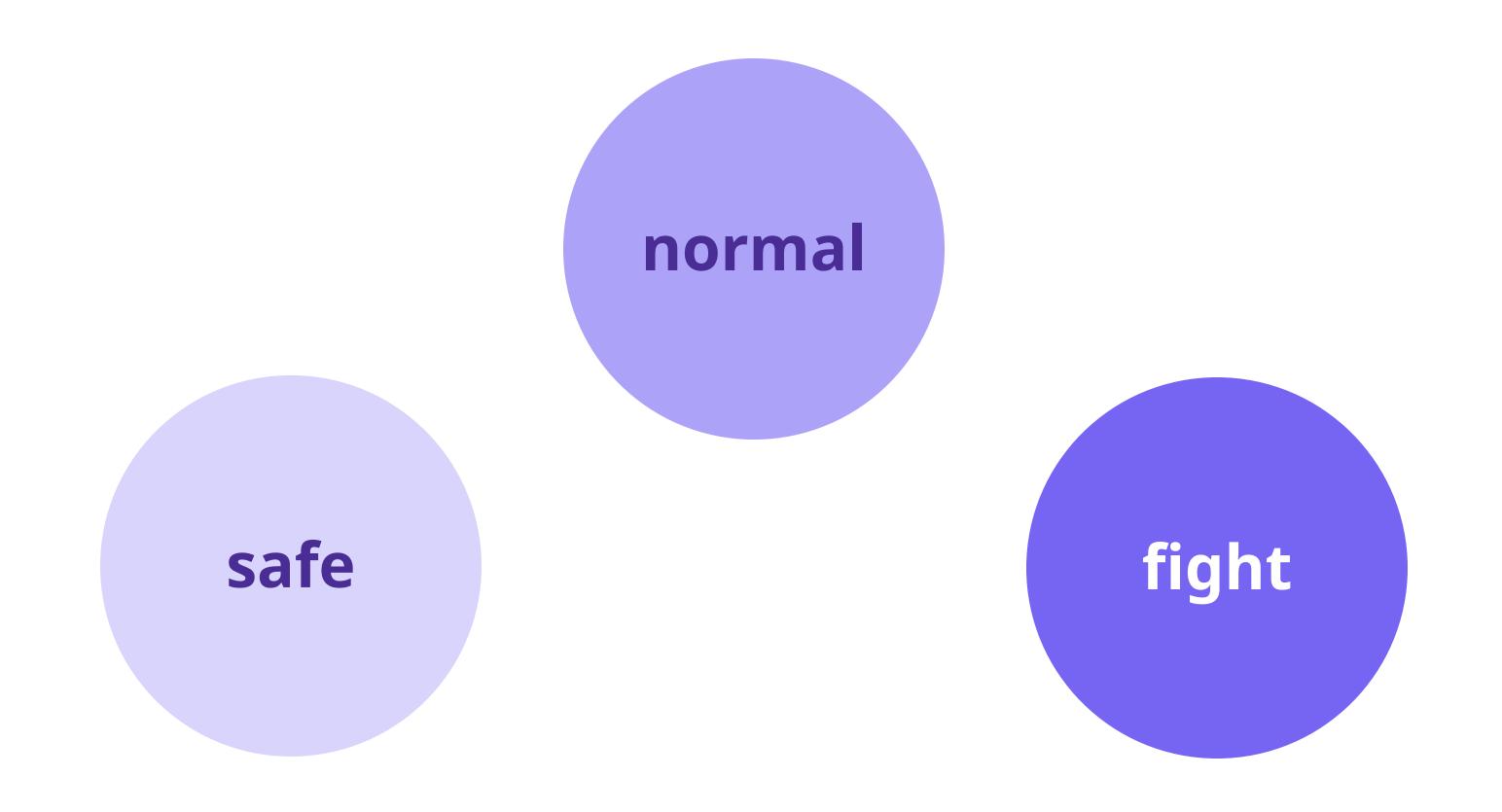
Demension Reduction & K-means Clustering

```
250+ features player 1: kill, death, assist, kda, kill_participation, rune, spell.... player 2: kill, death, assist, kda, kill_participation, rune, spell.... player 3: ....
```



20 features & 90% information

Demension Reduction & K-means Clustering



Results

Web Application

첫 번째 챔피언

submit

추천 챔피언 순위

비추천 챔피언 순위

rell	49.61	55.48	15 K/	fight:50.92% -> safe:49.78% -> normal:49.29%	kindred	II .			safe:50.9% -> normal:49.52% - > fight:49.1%
renata	49.61	52.33	1111	normal:50.56% -> safe:50.47% -> fight:49.69%	viktor	II .			safe:49.87% -> fight:49.58% -> normal:49.24%
sylas	49.61	51.83	2.22	safe:50.17% -> fight:50.03% -> normal:49.76%	azir	49.61	46.69	-2.92	fight:51.02% -> normal:49.76% -> safe:48.74%
	49.61		2.21	normal:49.67% -> safe:49.37% -> fight:49.07%	yuumi		47.34	-2.21	fight:49.14% -> normal:48.27% -> safe:48.18%
II .				normal:50.62% -> safe:50.22% -> fight:50.09%	syndra	II .			safe:50.58% -> fight:50.0% -> normal:49.89%
kaisa	49.61	50.99	1.38	normal:50.31% -> safe:50.26% -> fight:49.66%	amumu	49.61	47.77	-1.84	safe:50.25% -> fight:50.24% -> normal:49.73%
karma	49.61		0.01	normal:50.19% -> fight:49.96% -> safe:49.54%	alistar		47.91	-1./	normal:50.94% -> fight:49.4% - > safe:48.18%
maokai	49.61	50.3	0.69	normal:50.45% -> fight:50.2% -> safe:50.16%	viego	II .			normal:50.02% -> safe:49.79% - > fight:49.42%
taliyah	49.61		0.56	fight:50.24% -> safe:50.04% -> normal:49.11%	pyke	49.61	48.09	-1.52	normal:50.23% -> safe:48.2% - > fight:47.94%
thresh	49.61			fight:51.7% -> safe:49.89% -> normal:49.67%	kalista		48.2	-1.41	fight:50.86% -> normal:50.29% -> safe:49.74%
hecarim				safe:50.36% -> fight:49.87% -> normal:49.54%	akali	II .			normal:50.92% -> safe:49.4% - > fight:49.23%
blitzcrank	49.61	49.86	0.25	normal:50.51% -> safe:49.46% -> fight:49.45%	leesin	49.61	48.25	-1.36	normal:49.18% -> safe:49.15% - > fight:48.72%

두 번째 챔피언

submit

추천 챔피언 순위

비추천 챔피언 순위

nidalee	48.57	55.04	6.47	fight:50.85% -> normal:50.29% -> safe:49.67%	graves	48.57	43.36	-5.21	fight:50.21% -> safe:50.19% -> normal:49.81%
sylas	48.57	51.75	3.18	safe:50.17% -> fight:50.05% -> normal:49.76%	samira	48.57	47.79	-0.78	normal:49.6% -> fight:49.58% -> safe:49.13%
kaisa	48.57	48.63	0.06	normal:50.31% -> safe:50.26% -> fight:49.66%					

Evaluation

Evaluation

첫 번째 챔피언

submit

추천 챔피언 순위

비추천 챔피언 순위

alistar	48.91	51.03	2.12	normal:50.88% -> fight:49.45% -> safe:48.23%	nidalee				normal:50.8% -> fight:50.32% -> safe:49.66%
gragas	48.91	49.66	0.75	normal:50.89% -> fight:50.0% -> safe:49.92%	II		II I		normal:49.79% -> safe:49.78% -> fight:49.33%
rakan	48.91	49.31	0.4	fight:52.1% -> normal:50.35% -> safe:49.76%	yone	48.91	46.59	-2.32	fight:50.68% -> normal:50.18% -> safe:48.6%
					taliyah				fight:50.29% -> safe:50.06% -> normal:49.07%
					kaisa	48.91	48.12	-0.79	normal:50.33% -> safe:50.25% -> fight:49.67%
					sylas	48.91		-0.51	safe:50.18% -> normal:50.02% -> fight:49.77%
									normal:50.23% -> safe:48.2% -> fight:47.95%
					nautilus	48.91	48.8	-0.11	fight:50.9% -> normal:50.48% -> safe:49.63%
					aatrox	48.91	48.89	-0.02	safe:50.22% -> fight:49.81% -> normal:49.34%

첫 번째 챔피언

추천 챔피언 순위

비추천 챔피언 순위

submit

belveth	50.35	54.14	3.79	fight:53.07% -> normal:52.62% -> safe:50.54%					normal:50.56% -> fight:49.76% -> safe:48.73%
gangplank	50.35	52.35	11201	normal:53.02% -> safe:52.34% -> fight:51.68%	II .		1 1	1 1	fight:50.23% -> safe:50.03% -> normal:48.66%
hecarim	50.35	52.29	11 921	safe:50.32% -> fight:49.8% -> normal:49.71%	kindred	50.35	48.21	-2.14	safe:51.0% -> normal:49.51% -> fight:49.09%
	50.35		1.63	rignt:49.67%	nautilus	50.35			fight:50.93% -> normal:50.45% -> safe:49.62%
karma	50.35	51.74	1.39	normal:50.19% -> fight:49.93% -> safe:49.55%	vex	50.35			normal:50.55% -> fight:50.48% -> safe:49.97%
aatrox	50.35	51.66		normal:50.18% -> fight:49.88% -> safe:49.34%	zoe	50.35	49.12	-1.23	normal:50.66% -> safe:50.25% -> fight:48.29%
sejuani	50.35			safe:49.78% -> normal:49.75% -> fight:49.4%		50.35		-1.07	normal:49.22% -> safe:49.13% -> fight:48.68%
II I				normal:51.2% -> fight:49.77% -> safe:48.73%	ornn	50.35	49.33	-1.02	safe:51.08% -> fight:50.17% -> normal:49.74%
akali	50.35	51.21	0.86	normal:50.89% -> safe:49.4% -> fight:49.24%	galio	50.35	49.68	1-116/	normal:50.29% -> fight:49.13% -> safe:48.84%
	50.35		0.86	sate:49.66%	ashe	50.35	49.69	-0.66	normal:51.85% -> safe:50.24% -> fight:49.35%
gragas	50.35	51.17	0.82	normal:50.89% -> fight:50.0% -> safe:49.92%	azir	50.35	50.0	-0.35	normal:51.02% -> fight:49.76% -> safe:48.74%
irelia	50.35	51.02	III I I I I I I	fight:51.96% -> safe:49.67% -> normal:49.61%	camille	50.35	50.0	-0.35	fight:51.39% -> safe:49.92% -> normal:49.6%
	50.35		0.61	safe:50.58% -> normal:50.09% -> fight:49.84%	•	50.35		-0.3	safe:50.19% -> fight:50.05% -> normal:49.74%
taliyah	50.35	50.91	0.56	normal:50.28% -> safe:50.06% -> fight:49.06%	maokai	50.35	50.1	-0.25	fight:50.48% -> safe:50.16% -> normal:50.15%

Thank You