

Where Should New Grads Move?

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MSBA Fall 2024: Analytics for Unstructured Data

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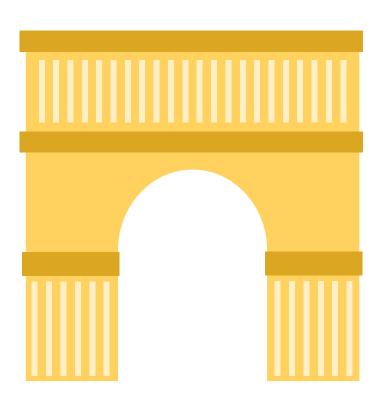




ANALYSIS

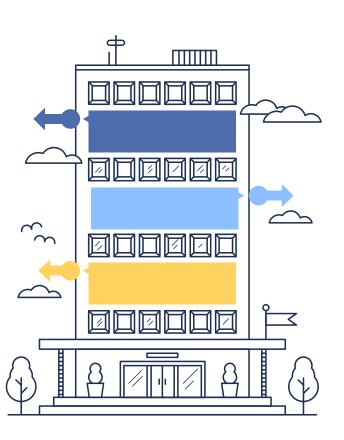






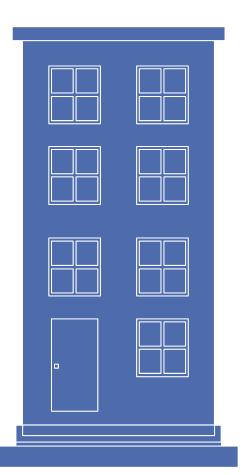
PROJECT INTRODUCTION

PROJECT INTRODUCTION



- Biggest question post-grad?
 - Owner of the control of the contr
- Some students stay in the same city and other move to experience a change
 - Our Goal: Help these students narrow down their choices based on how similar cities are and how the attributes they want fit into this

DATA SOURCING



GETTING OUR DATA

- Scraped data from various city subreddits
 - Used the current Top 10 cities, expanded to Top 20 for further analysis
 - Scraped information:
 - Title
 - Body
 - Up Votes
 - Top 5 Comments
- Based on scraped data....
 - word counts by city
 - total word counts
 - weighted the word counts for each based on upvotes
 - From this list identified key attributes



Sneak Peak

Scraped Posts/Comments

⊿ A												М	
Subreddit	Title	Body	Score	URL	Comment	Comment	Comment	Comment	Commer	nt 5			
seattle	Weekly As	This threa	1	https://wv	Hi all, Iâ€	"m plannii	ng a first he	ouse purch	ase and a	am looking	for any reco	ommenda	tions you ha
seattle	When you	My wife co	785	https://wv	I walked t	I was tann	Today I we	My UV ligh	lt's m	id-Octobe	r. Time for th	e long da	rk.
seattle	Gold Creel	My wife wa	383	https://wv	Because a	It is so fru	l'm soi	The onion	Having w	orked for	the national	park serv	ice for seven
seattle	ALL MY WS	*WANNA	424	https://wv	I watched	My husba	Why not it	When son	l'll ha	ve whateve	er drugs you	're on.	Please.
seattle	What's	Is this a ba	50	https://wv	It's no mo	4:30am aı	are you ta	But I was	Belltown	hellcat no	w these guy	s. Sleeple:	ss in Seattle
seattle	Rant! Seat	But I donâ	247	https://wv	So sorry th	I see so m	My rent (n	If busines	The Office	e of Econo	mic Develop	ment (OE	D) Offers hel
seattle	Sub Sandy	Hello good	7	https://wv	You hafta	My Go-To	I need to t	Tats is a g	We are re	eally lackin	ng in that de	partment.	I like lyons o
seattle	Monday C	*As a note	7	https://ww	w.reddit.o	om/r/Seat	tle/comme	ents/1g3i6l	/monday	_capitol_h	ill_board_ga	me_night	730_pm_at/
seattle	Ballard ai	Heard it la	20	https://wv	It's absolu	I woke up	Where is i	it? I'm not I	nearing it	12	11		
seattle	What is wi	This is the	13	https://wv	Fire on N7	Came her	I love that	https://we	Police ca	r choir pra	actice		
seattle	Where to f	I haven't th	13	https://wv	RIP the m	It's not qu	Bowling a	hospitals	- ray gur	lounge in	capitol hill	- Great wa	ıll mall has a
seattle	What's you	I'm might	25	https://wv	Kenmore	I still have	If you hav	lâ€"ve be	Donâ€"t	know if yo	uâ€"ve ever	been to M	oPOP, but it
seattle	Seattle Pa	Has anyor	1	https://ww	w.reddit.o	om/r/Seat	tle/comme	ents/1g3kzt	2/seattle_	parks_full	_parking_lot	_but_emp	ty_park/
seattle	Apologies	You guys a	0	https://ww	How muc	Yeah Oreg	They're al	Given hov	Laccept	your apolo	gy and ask	ou to dec	lare EVERY O
seattle	Miles "Hel	At the time	210	https://wv	What will	Goddamr	l'm sui	Now there	Fuck Mile	es Hudson	. Fuckface.		
seattle	Where car	it's all i	11	https://wv	Met Marke	lâ€"ve se	Whole Fo	Ballard Sa	RIP the H	lop-In			
seattle	Any self-er	Im trying t	18	https://wv	Did you cl	i'm stu	Not an ex	Call them	They just	take your	taxes so eas	ily and m	ake it extra c
seattle	Mental He	Today I wi	607	https://wv	I'm so sor	I had som	Sorry you	Be sure yo	I just rec	ently finish	ned a rehab	stint beca	use I just felt
seattle	Ballard Br	Constructi	10	https://wv	Seeing the	Fav bridge	9			1000			
seattle	Local Roa	I was in Co	4	https://wv	Vita has t	My favorit	Our local	Olympia I	You shou	uld check o	out Black Arr	ows Coffe	e! I bought s
seattle	PSA: Traffi	Avoid 520.											o. I'm tryi
seattle	I'm loving	If people s											year and all
seattle		lâ€"ve bee											s. There is o
seattle	and the same of th	Both direc		https://wv									

Weighted Word Counts By City

		$\overline{}$																	
4 A	В	C	D	E	F	G	н	- 1	J	K	L	M	N	0	P	Q	R	S	T
Word	▼ Boston -	Columt *	Denver *	Detroit *	Jackso *	LasVeg -	LosAng *	Nashvi *	Portlan *	SanFra *	austin 💌	chicage *	dallas 🕶	housto * r	nyc 💌	philad∈ *	phoeni *	sandie *	seattle
the	248465	236720	377401	149034	95916	62107	104518	174209	454992	252285	560050	409088	192626	283986	88482	109686	341153	155285	4728
i	168650	197735	240875	88851	72910	38788	103685	116681	369280	133298	375299	232789	101383	111379	68282	76060	264331	123412	1927
to	166203	203063	308787	87565	73605	33663	73257	136288	289687	140137	386200	333592	113348	167765	64250	75154	314702	126025	3045
and	153739	181195	319618	97824	64866	32533	77337	115076	340489	144775	335410	246916	132318	188319	43185	72537	236847	118199	23526
а	138900	165250	258686	84802	53952	36719	70079	124355	264992	124812	333298	255404	99548	157869	47963	62124	189275	109694	20899
of	94357	98422	173941	51598	38316	19764	33488	71643	207922	82056	234563	179703	79098	132503	47562	38973	138253	65611	16286
in	83600	96739	125756	53945	36479	17272	48470	82015	159994	74402	210655	135034	71443	118136	35859	44326	167843	67511	16784
it	78464	86786	131632	47467	40391	19663	43511	73089	185243	86413	202326	125403	68658	72250	30898	46511	141236	59361	13561
you	70306	72996	120731	54328	37191	17631	36136	59554	130133	55858	155995	113393	43857	56417	33929	29427	113540	51137	12650
is	64906	77194	95634	34648	28554	12791	19177	46619	133163	58772	165559	112275	49435	73804	24288	29298	109452	46155	12854
for	63753	75510	130363	41036	30844	14556	20308	50060	131502	54561	164296	91733	38785	63190	26429	32841	93377	43966	11241
s	57910	61287	108587	34474	22725	13012	28285	62398	113127	64820	155119	88635	49427	71072	15639	27953	71903	41616	12134
that	57259		92252				22949	56753	110913		142685	73035			19624	31955	73836	41426	9302
on	52349	51266	89548	27845	24467	11359	25144	48856	83923	48632	146789	131082	34098	44545	17648	16857	98361	37192	8428
this	49474	44776	90683		14128		21463	37145	117345		167331	103253		54294	26814	20286	109431	28636	8521
7 t	44211	51435	67224	26148	20157	8509	21889	45979	65939	42336	94761	85668	32194	31095	16854	19312	67475	39085	7708
was	43881	44387	61645	30062	15365	12871	29920	35136	112908	30953	122836	77472	22418	49205	12281	19150	80957	26260	8598
they	41022	52591	80061	23967	18880	5966	18968	27052	58919	23560	94750	73440	29556	37660	5512	23148	40510		3927
with	40680	40465	85445	20200	14904	7487	16989	24204	74176	28154	65486	61958	30477	47241	9089	18023	44680	22701	5520
my	39935	37117	82579	17823	19018		15489	30027	84780	34023	121676			32193	6666	18012	59472	36682	5056
at	39933	40133	67282	21798	17002	13725	20263	24786	49911	32678	101814	54570	65027	39598	5271	17393	56631	27932	5198
but	38865	35123	57514	18108	16262	9064	15997	27610	70614	30202	91291	53895	21440	30183	12275	18514	49175	24328	4714
boston	34496	0	5	651	. 0	0	60	4	1558	0	2961		0	282	0	28	0	16	10

Word Counts By City

A	В	С	D	E	F	G	Н	1	J	K	L	M	N	0	P	Q	R	S	T
,	seattle 🚚	austin 💌	dallas 🔻	housto *	chicag(*	sandie v ny	C Y	phoeni *	philad∈ ▼	Columt *	Denver *	Nashvi 🕶	LasVeg *	Detroit *	Portlan *	Jacksoi *	Boston *	SanFra *	LosAng
the	2382	4777	3231	3318	4706	3161	613	4119	1440	4355	4536	3028	4082	3427	2381	3130	5183	3931	
to	1711	3832	2085	2404	4842	2658	358	4964	982	3558	3745	2388	2813	2447	1729	2633	3790	2684	1 52
a	1448	3518	1932	2296	2786	2566	340	3074	990	3307	3410	2335	2573	2278	1670	2423	3280	2286	6 48
i	1421	3547	1780	2116	2262	2619	23:	3125	961	3475	3333	2539	2424	2288	1905	2533	3173	2276	5 54
and	1365	3462	2099	2287	2585	2436	336	2990	967	3212	3456	1996	2477	2157	1789	2366	3184	2477	7 51
of	891	1932	1275	1452	1792	1340	308	2187	529	1854	1931	1262	1302	1292	1095	1326	2175	1497	
it	890	2075	1077	1127	1244	1350	166	1730	628	1759	1742	1341	1359	1330	1065	1397	1675	1293	3 36
in	870	2037	1317	1506	1666	1529	236	2421	576	1978	1840	1518	1496	1582	874	1473	2201	1575	5 34
you	773	2027	914	1066	1418	1282	13	1888	432	1654	1623	1116	1493	1226	911	1337	1913	1251	1 20
is	706	1481	840	1039	1066	1146	149	1528	400	1562	1404	981	1245	1030	704	1176	1561	1114	4 20
for	675	1778	936	1070	1266	1202	123	1506	411	1742	1780	1157	1374	1150	735	1321	1631	1074	4 20
on	561	1272	675	749	1858	811	129	1634	291	1073	1200	757	875	751	544	855	1218	877	7 19
that	537	1286	720	904	900	878	99	973	386	1243	1204	888	788	864	609	854	1191	894	4 17
s	531	1342	725	931	990	912	12	1075	367	1292	1150	954	931	906	681	969	1057	960	23
t	471	962	488	567	864	652	53	3 730	231	885	950	678	672	654	433	663	942	687	7 11
but	409	982	498	613	594	680	78	749	279	968	924	693	721	640	459	720	896	630	11
this	396	878	457	543	1160	541	102	1384	281	731	864	497	354	557	560	437	1016	625	5 14
have	360	1038	511	651	838	723	6:	1 1235	273	1061	987	704	697	712	408	745	906	646	5 12
they	354	1024	517	607	574	611	69	633	293	901	904	635	508	672	388	699	798	526	5 11
if	353	896	406	503	760	614	59	1100	216	819	755	533	623	525	380	566	977	552	2 8
are	351	885	439	579	556	541	73	675	218	844	812	537	741	539	356	703	914	641	1 12
was	342	754	387	446	706	514	5.	895	225	689	623	515	442	556	474	431	594	444	1 17
with	339	859	529	587	498	577	85	566	255	812	993	514	575	519	434	575	760	543	3 10
at	337	860	1092	496	512	567	63	966	248	741	844	532	962	561	380	559	773	566	5 13
or	335	818	419	508	988	570	41	1473	217	780	693	433	631	508	311	554	818	494	4 9
be	323	824	441	574	1096	550	58	1007	201	727	772	515	692	543	391	598	820	560	13
my	313	914	460	513	488	660	50	597	253	797	856	537	567	492	423	639	693	484	1 14
can	295	683	297	399	354	476	66	5 500	162	621	605	371	482	374	281	466	562	422	2 7
seattle	290	0	0	1	2	0		1 1	1	0	0	1	2	1	4	1	0		

LIST OF TOP CITIES

AUSTIN

DALLAS

HOUSTON

CHICAGO

SAN DIEGO

LOS ANGELES

PHOENIX

SEATTLE

PHILADELPHIA

NEW YORK CITY



BOSTON

PORTLAND

(OREGON)

DENVER

NASHVILLE

LAS VEGAS

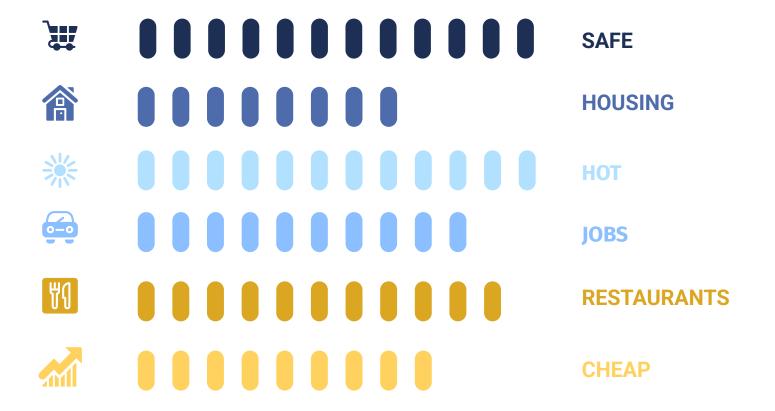
DETROIT

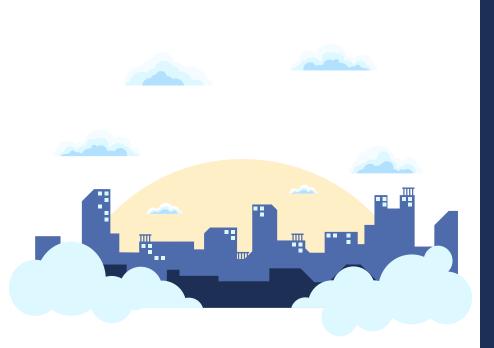
COLUMBUS

JACKSONVILLE

SAN FRANCISCO

ATTRIBUTES/FEATURES

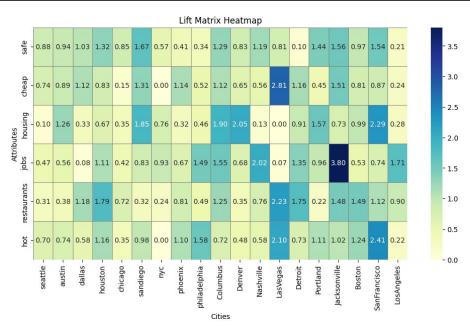




OUR ANALYSIS

Lift Matrices

Lift Matrix																			
	seattle	austin	dallas	houston	chicago	sandiego	nyc	phoenix	philadelphia	Columbus	Denver	Nashville	LasVegas	Detroit	Portland	Jacksonville	Boston	SanFrancisco	LosAngeles
safe	0.875485	0.943478	1.034941	1.323834	0.845319	1.667589	0.569676	0.414578	0.342942	1.291498	0.831891	1.191897	0.809546	0.097815	1.438962	1.557427	0.971805	1.540727	0.210434
cheap	0.744673	0.891674	1.117846	0.828345	0.147490	1.313355	0.000000	1.141861	0.518579	1.117799	0.653162	0.563226	2.805350	1.164801	0.445075	1.506546	0.808232	0.873678	0.238656
housing	0.097193	1.256894	0.328272	0.668952	0.346501	1.851291	0.758918	0.315599	0.456865	1.901631	2.045978	0.132320	0.000000	0.912161	1.568433	0.732280	0.992550	2.294020	0.280339
jobs	0.474984	0.563060	0.080214	1.114496	0.423340	0.829337	0.927214	0.674774	1.488474	1.548888	0.676999	2.020780	0.073202	1.353249	0.958122	3.802338	0.527241	0.737562	1.712528
restaurants	0.311188	0.375598	1.177170	1.791341	0.721117	0.316127	0.242987	0.808376	0.487590	1.246704	0.354831	0.762579	2.225264	1.752310	0.223188	1.484900	1.492232	1.121062	0.897575
hot	0.697876	0.735363	0.576179	1.164435	0.345554	0.984657	0.000000	1.101578	1.579471	0.722452	0.476091	0.580615	2.103246	0.727735	1.112283	1.022390	1.239449	2.408160	0.223658



Recommendation Model



For the cost-conscious restaurant goer (attributes are "bars", "cheap", "restaurants")

Recommendations Based on Your Preferences:

City	Similarity	Average_Sentiment_Score	Overall_Score
Jacksonville	0.392390	0.200902	0.078832
LasVegas	0.421752	0.181574	0.076579
sandiego	0.386492	0.194135	0.075032
Columbus	0.401450	0.177279	0.071168

For the grad student looking to settle down (attributes are "clean", "safe", "kids")

Recommendations Based on Your Preferences:

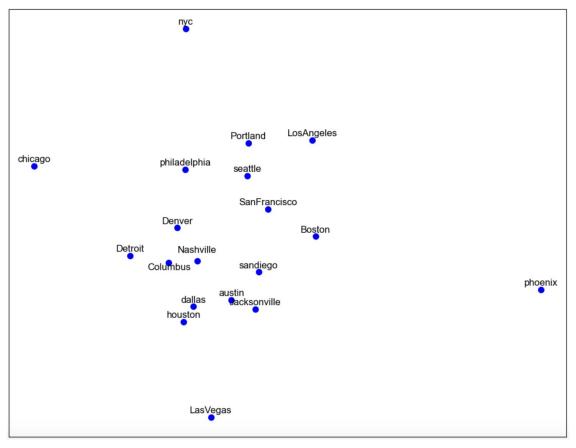
City	Similarity	Average_Sentiment_Score	Overall_Score
phoenix	0.195308	0.176652	0.034502
Portland	0.201568	0.136471	0.027508
seattle	0.160669	0.158653	0.025491

For the active socializer (attributes are "sports", "theatre", "bars")

Recommendations Based on Your Preferences:

City	Similarity	Average_Sentiment_Score	Overall_Score
LasVegas	0.269316	0.181404	0.048855
SanFrancisco	0.241389	0.185089	0.044679
Detroit	0.231839	0.180810	0.041919
chicago	0.226385	0.164338	0.037204

MDS Plot of City Similarities



Pairing Systems

User-Input Driven

Enter a city name: houston

```
Top 3 Big Cities closest to 'houston':
dallas
austin
sandiego
```

Top 3 Small Cities closest to 'houston': Columbus Nashville Jacksonville





Static

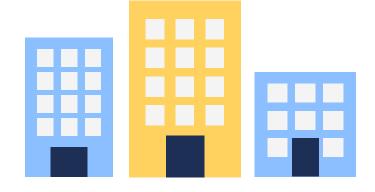
City Pairings Based on MDS Similarities:

Big City	Paired Big City	Paired Small City
Losangeles	Seattle	Portland
Austin	Dallas	Jacksonville
Chicago	Philadelphia	Detroit
Dallas	Houston	Nashville
Houston	Dallas	Columbus
New York	Philadelphia	Portland
Philadelphia	Seattle	Denver
Phoenix	Losangeles	Boston
San Diego	Austin	Jacksonville
Seattle	Philadelphia	Portland

City Pairings Based on MDS Similarities:

Small City	Paired Small City	Paired Big City
Columbus	Nashville	Dallas
Denver	Columbus	Philadelphia
Nashville	Columbus	Dallas
Lasvegas	Jacksonville	Houston
Detroit	Columbus	Dallas
Portland	Sanfrancisco	Seattle
Jacksonville	Nashville	Austin
Boston	Sanfrancisco	San Diego
Sanfrancisco	Boston	Seattle

FINAL THOUGHTS





FOR LISTENING

THANK YOU