



The background features several large, abstract blue shapes. There is a small circle in the top left, a large curved line in the top right, a thick diagonal line crossing the bottom right, and various other curved segments and a small circle scattered throughout the lower half of the image.

# Housing Dashboard (DB-Ver)

By Raymond Song, Alan Zhang



# Why Housing Dashboard?

- You move to a new area and start looking for housing, you want to know how the listing compares to others
  - For similar listings in your area, is the listing more expensive or less expensive
  - Does it offer the amenities that you want?
  - Is the surrounding area convenient for living (Groceries, Transportation)?
- 
- 

# Databases

MongoDB:

- Best solution as we want to aggregate listings from multiple sources
  - Zillow, Apartment.com, Craigslist, listings from property websites
  - Listings gathered from the San Diego County
- Store housing listings for easier aggregates.
- Individual houses are not related through relationships

# Databases (Cont.)

Neo4j:

- Spatial package provides geographic search.
- Houses are not stored in Neo4j, only passed along to neo4j as a tuple pair (lat, long) to find nearby businesses
- Easier querying between Businesses and Categories as well as bus stops and routes

# Prepping the raw data

- Collected using a combination of web scraping and API
- Unify features have different column names
  - E.g. num\_baths instead of baths
  - Convert all of them to standard key
- Ensure that data such as “\$4,600+” gets stored as 4600 so it can be queried
- Try to remove anomalies from the data
- Tried to gather all amenities listed as its own column into one column named ‘amenities’

[60]

```
1 garden = pd.read_csv('../data/housing/raw/garden_community-2022-07-05.csv')
2 garden.head()
```

✓ 0.1s

Python

...

name	community_address	community_mobile	overview_text	floor_plan_name	bath_num	bed_num	price_info	area_info	...	Upgraded Residence Amenities	Appliances
luxury rents	9065 Sydney Court, San Diego, CA	(858) 358-7681	Up to First Month Free!* *All prices and spec...	Compass	1 Bath	Studio	\$2,725 - \$3,225	662 - 743 sq.ft.	...	NaN	NaN
luxury rents	9065 Sydney Court, San Diego, CA	(858) 358-7681	Up to First Month Free!* *All prices and spec...	Escape	1 Bath	1 Bedroom	\$3,135 - \$3,610	874 sq.ft.	...	NaN	NaN
luxury rents	9065 Sydney Court, San Diego, CA	(858) 358-7681	Up to First Month Free!* *All prices and spec...	Escape with Loft	1 Bath	1 Bedroom	\$3,610 - \$3,960	1016 - 1105 sq.ft.	...	NaN	NaN
luxury rents	9065 Sydney Court, San Diego, CA	(858) 358-7681	Up to First Month Free!* *All prices and spec...	Evolve	1 Bath	1 Bedroom	\$3,135 - \$3,410	880 - 909 sq.ft.	...	NaN	NaN
luxury rents	9065 Sydney Court, San Diego, CA	(858) 358-7681	Up to First Month Free!* *All prices and spec...	Evolve with Loft	1 Bath	1 Bedroom	\$3,610	1028 sq.ft.	...	NaN	NaN

Size	Availability	Rent	Monthly Fees	One Time Fees	Transportation	Education	Pet Policy	Distance	Duration	Parking	Amenities
['Studio, \$2,320 – \$2,415, Studio, ,, 1 bath, ...		\$2320-3610	NaN	* Application Fee: \$25 * Cat Deposit: \$250	Transit / Subway, Distance, Transit / Subway, ...	Colleges & Universities, Distance, Colleges & ...	Cats Allowed, Restrictions:, \$250 deposit for ...	NaN	NaN	Restrictions:, \$250 deposit for one cat. \$400 ...	Community Amenities, Pool, Fitness Center, Lau...
['Florentine, \$2,445 – \$2,595, 1 bed, ,, 1 bat...		\$2445-3655	NaN	* Application Fee: \$25 * Cat Deposit: \$250	Transit / Subway, Distance, Transit / Subway, ...	Colleges & Universities, Distance, Colleges & ...	Cats Allowed, Restrictions:, \$250 deposit for ...	NaN	NaN	Restrictions:, \$250 deposit for 1 cat. \$400 de...	Community Amenities, Pool, Fitness Center, Lau...
['Soledad, \$2,475 – \$2,725, Studio, ,, 1 bath,...		\$2475-4950	NaN	* Application Fee: \$46	Transit / Subway, Distance, Transit / Subway, ...	Colleges & Universities, Distance, Colleges & ...	Parking, Garage, 1 space, Assigned Parking, On...	NaN	NaN	Garage, 1 space, Assigned Parking, One Bedroom...	Community Amenities, Pool, Fitness Center, Ele...
['1C, \$3,665 – \$5,650, 1 bed, ,, 1 bath, ,, 90...		\$3665-8710	NaN	* Application Fee: \$47	Transit / Subway, Distance, Transit / Subway, ...	Colleges & Universities, Distance, Colleges & ...	Other Fees, Application Fee, \$47	NaN	NaN	NaN	Community Amenities, Pool, Fitness Center, Lau...
['One Bedroom / One Bath, \$2,875 – \$3,325, 1 b...		\$2875-4350	NaN	* Application Fee: \$49 * Cat Deposit: \$500 * ...	Transit / Subway, Distance, Transit / Subway, ...	Colleges & Universities, Distance, Colleges & ...	Dogs Allowed, Restrictions:, We welcome 2 pets...	NaN	NaN	Restrictions:, We welcome 2 pets per apartment...	Community Amenities, Pool, Fitness Center, Clu...

```

1 zillow = pd.read_csv('../data/housing/raw/zillow-2022-07-05.csv')
2 zillow.head()

```

✓ 0.0s

Python

	statusText	detailUrl	latLong	units	...	isUserClaimingOwner	isUserConfirmedClaim	pgapt	sgapt	zestima
·	Solazzo Apartments Homes	/b/solazzo-apartments-homes-la-jolla-ca-5Xk5YK/	{'latitude': 32.86568, 'longitude': -117.235725}	[{'price': '\$3,165+', 'beds': '1'}]	...	NaN	NaN	NaN	NaN	Na
·	Ocean House on Prospect Apartment Homes	/b/ocean-house-on-prospect-apartment-homes-la-...	{'latitude': 32.841976, 'longitude': -117.27955}	[{'price': '\$5,340+', 'beds': '1'}, {'price': ...}]	...	NaN	NaN	NaN	NaN	Na
·	Apartment for rent	https://www.zillow.com/homedetails/7623-Eads-A...	{'latitude': 32.842457, 'longitude': -117.27549}	NaN	...	False	False	ForRent	For Rent	Na
·	For Rent	/b/La-Jolla-CA/32.841022,-117.275635_II/	{'latitude': 32.841022, 'longitude': -117.275635}	[{'price': '\$5,975+', 'beds': '3'}]	...	NaN	NaN	NaN	NaN	Na
·	Apartment for rent	https://www.zillow.com/homedetails/2205-Camini...	{'latitude': 32.81866, 'longitude': -117.234184}	NaN	...	False	False	ForRent	For Rent	1304800

- Need to extract latitude and longitude from the dictionary and get the price and beds for properties that have multiple listings

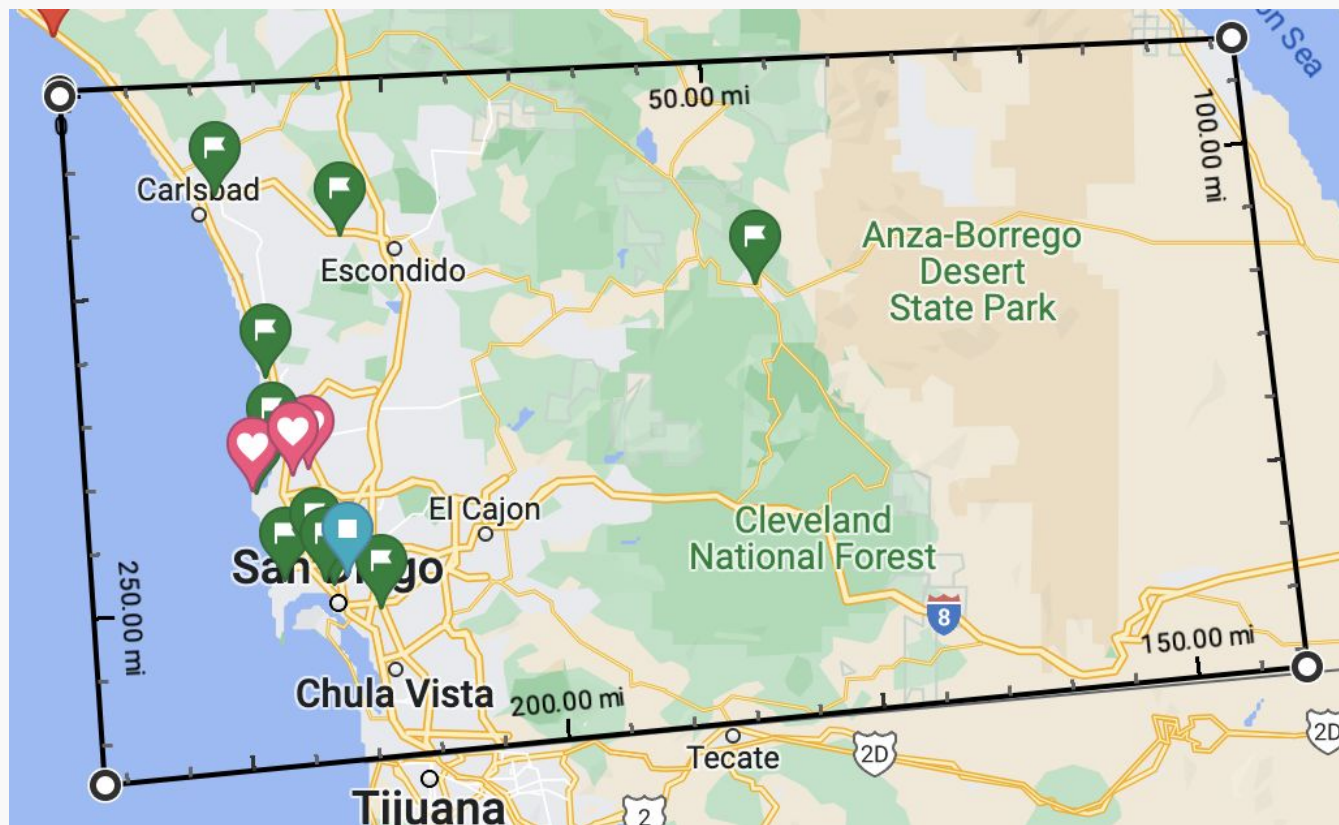


url	post_id	post_date	description	num_beds	num_baths	price	address	sqft	features	scrape_date
<a href="https://sandiego.craigslist.org/ocd/realty/7495575791.html">https://sandiego.craigslist.org/ocd/realty/7495575791.html</a>	7495575791	2022-06-12T09:15:4	SAN DIEGO, MISSIO x 187OR Text 187 to text our team dire	2	2	4125			-1 ['air conditioning', 'c	2022-07-05 0:11:14
<a href="https://sandiego.craigslist.org/ocd/realty/7498454629.html">https://sandiego.craigslist.org/ocd/realty/7498454629.html</a>	7498454629	2022-06-19T06:55:4	g 2 rooms one has a	2	shared	1400	6634 alcala knolls dr		-1 ['house', 'laundry on	2022-07-05 0:11:17
<a href="https://sandiego.craigslist.org/ocd/realty/7500408184.html">https://sandiego.craigslist.org/ocd/realty/7500408184.html</a>	7500408184	2022-06-23T16:22:2	all Now - show conta This is a 3 Bedroom	3	2	4850	5040 Camino San Fe	1205	['EV charging', 'air co	2022-07-05 0:11:22
<a href="https://sandiego.craigslist.org/ocd/realty/7493144309.html">https://sandiego.craigslist.org/ocd/realty/7493144309.html</a>	7493144309	2022-06-06T13:29:2	Apartment Living Yo x 99OR Text 99 to s to text our leasing te	2	2	3372	2185 Station Village		-1 ['apartment', 'w/d in u	2022-07-05 0:11:24
			Apex Mission Valley							
			Residents are always							
<a href="https://sandiego.craigslist.org/ocd/realty/7498345212.html">https://sandiego.craigslist.org/ocd/realty/7498345212.html</a>	7498345212	2022-06-18T17:14:4	Join us! Call today a	2	2	3500			-1 ['EV charging', 'air co	2022-07-05 0:11:27
			San Diego's most po							
			-Large Closets -Pet-Friendly Commu -Centralized Location -Short Term Lease -Washer/Dryer -Select Homes Below -Private Balcony -Wheelchair Accessi -Sundeck -Street Parking -After-Hours Courtes							
<a href="https://sandiego.craigslist.org/ocd/realty/7503686488.html">https://sandiego.craigslist.org/ocd/realty/7503686488.html</a>	7503686488	2022-07-01T14:48:4		2	2	3570	5395 Napa St		-1 ['EV charging', 'air co	2022-07-05 0:11:29
			Society, managed by 610 Del Sol San Diego, CA 9210 show contact info							
			The Society offers yo							
			This two bedroom tw							
			VIEW OUR WEBSITE							
			http://www.hollandre							
<a href="https://sandiego.craigslist.org/ocd/realty/7492691615.html">https://sandiego.craigslist.org/ocd/realty/7492691615.html</a>	7492691615	2022-06-05T12:30:3	[#9253505]	2	2	4000	610 Del Sol		-1 ['EV charging', 'air co	2022-07-05 0:11:31

# CA Businesses

- JSON data gathered from the SDSC database and cleaned
- Filtered down to SD businesses as businesses outside of the San Diego County will not have neighboring nodes
- Save down on resources (for the scope of this project)

```
1 with open('../data/ca_business.json', 'r') as f:
2     data = json.load(f)
3
4 sd_businesses = []
5 for line in tqdm(data):
6     if type(line) == dict:
7         lat, lng = line['latitude'], line['longitude']
8         if lat < 33.363442 and lat > 32.534317 and lng > -117.547484 and lng < -115.974969:
9             if '_id' in line:
10                 del line['_id']
11             sd_businesses.append(line)
12
13 with open('../data/sd_business.json', 'w') as f:
14     json.dump(sd_businesses, f)
```



# SD Business (Open)

Find out whether the business state is 'permanently closed' and remove it from the database

```
1 # Find businesses with cafe or restaurant in the category
2 closed_pattern = re.compile(r"(?i)\b(?:permanently closed)\b")
3 closed_filer = {"state": closed_pattern}
4
5 # Define the update operation
6 update_closed = {"$set": {"closed": True}}
7
8 result_closed = collection.update_many(closed_filer, update_closed)
9 print("Businesses marked as closed:", result_closed.modified_count)
10
11 # Define the filter condition for the remaining businesses
12 remaining_filter = {"closed": {"$exists": False}}
13
14 # Define the update operation to set the remaining businesses as not closed
15 update_remaining = {"$set": {"closed": False}}
16
17 # Update the remaining businesses to set closed as false
18 result_remaining = collection.update_many(remaining_filter, update_remaining)
19 print("Remaining businesses marked as not closed:", result_remaining.modified_count)
```

✓ 0.8s

Businesses marked as closed: 3251

Remaining businesses marked as not closed: 43141

# Cafes/Restaurants

```
1 # Find businesses with cafe or restaurant in the category
2 food_pattern = re.compile(r"(?i)\b(?:cafe|restaurant)\b")
3 food_filter = {"category": food_pattern}
4
5 # Define the update operation
6 update_food = {"$set": {"food": True}}
7
8 # Update documents matching the filter condition
9 result = collection.update_many(food_filter, update_food)
10
11 # Print the number of documents updated
12 print("Food businesses labeled updated:", result.modified_count)
13
14 # Define the filter condition for the remaining businesses
15 remaining_filter = {"food": {"$exists": False}}
16
17 # Define the update operation to set the remaining businesses as not closed
18 update_remaining = {"$set": {"food": False}}
19
20 # Update documents matching the filter condition
21 result = collection.update_many(remaining_filter, update_remaining)
22
23 # Print the number of documents updated
24 print("Non Food businesses labeled updated:", result.modified_count)
```

✓ 1.3s

Food businesses labeled updated: 8550

Non Food businesses labeled updated: 37842

# Grocery Stores

```
1 # Find businesses with grocery in the category
2 grocery_pattern = re.compile(r"(?i)\b(?:grocery|food store)\b")
3 grocery_filter = {"category": grocery_pattern}
4
5 # Define the update operation
6 update_grocery = {"$set": {"grocery": True}}
7
8 # Update documents matching the filter condition
9 result = collection.update_many(grocery_filter, update_grocery)
10
11 # Print the number of documents updated
12 print("Grocery/Convenience updated:", result.modified_count)
13
14 remaining_filter = {"grocery": {"$exists": False}}
15
16 update_remaining = {"$set": {"grocery": False}}
17
18 res = collection.update_many(remaining_filter, update_remaining)
19
20 # Print the number of documents updated
21 print("Non Grocery/Convenience updated:", res.modified_count)
```

✓ 0.9s

Grocery/Convenience updated: 887

Non Grocery/Convenience updated: 45505

# Schools

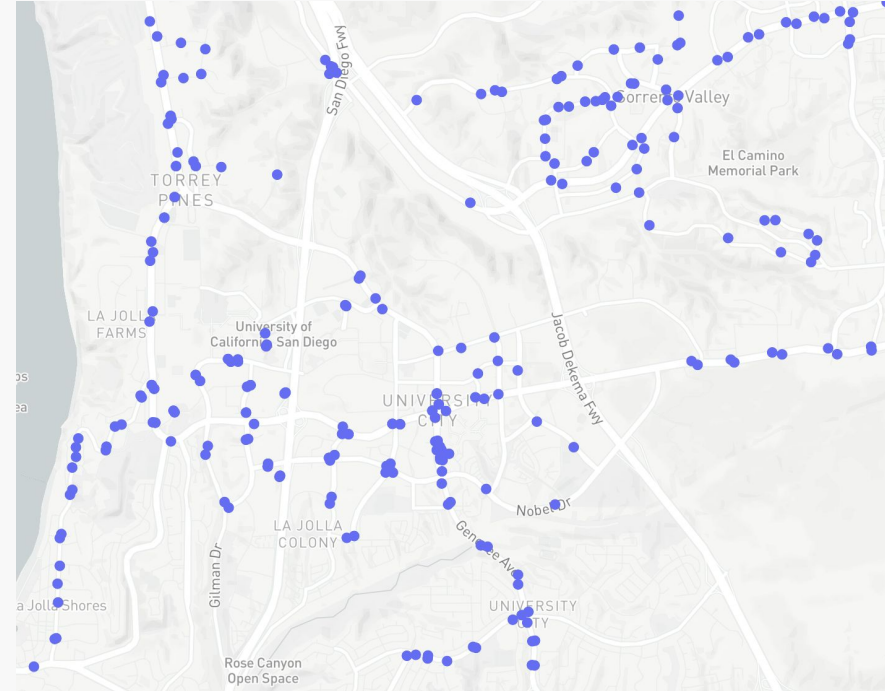
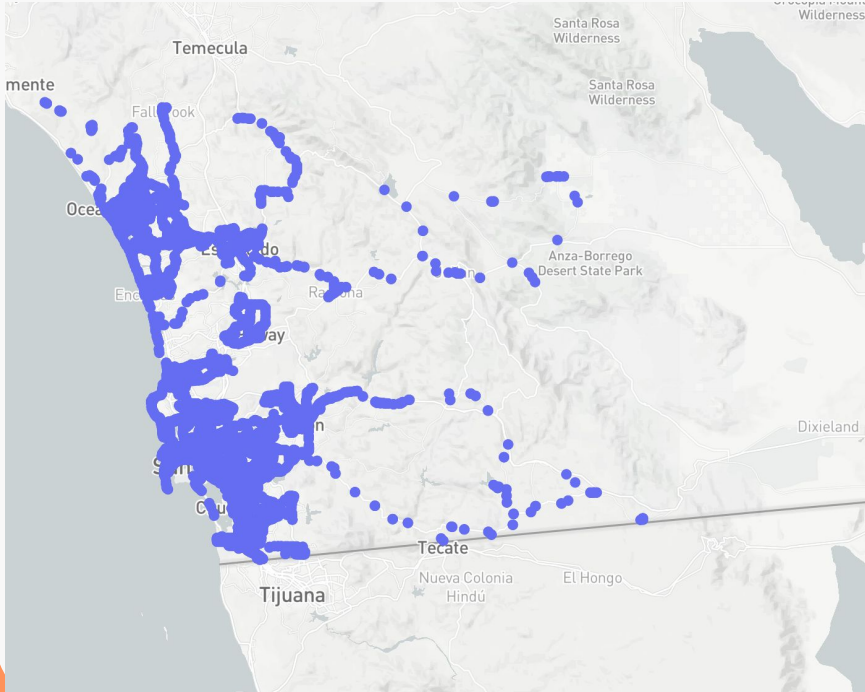
```
1 # Find businesses with grocery in the category
2 school_pattern = re.compile(
3 | r"(?i)^(?:after school|charter school|education|elementary school|middle school|private university|primary school|preschool|university)$"
4 )
5 school_filter = {"category": school_pattern}
6
7 # Define the update operation
8 update_school = {"$set": {"school": True}}
9
10 # Update documents matching the filter condition
11 result = collection.update_many(school_filter, update_school)
12
13 # Print the number of documents updated
14 print("Schools updated:", result.modified_count)
15
16 remaining_filter = {"school": {"$exists": False}}
17
18 update_remaining = {"$set": {"school": False}}
19
20 res = collection.update_many(remaining_filter, update_remaining)
21
22 # Print the number of documents updated
23 print("Non School updated:", res.modified_count)
```

✓ 1.4s

Schools updated: 192  
Non School updated: 46200



# Bus stops





# Filtering the listings

- Price : 2400 - 4000, Sqft  $\geq$  850, In-Unit Washer Dryer, Allows pet



```
1 # Find listing that has a price between 2400 - 4000 a month, In-Unit Washer Dryer and Allows pet
2
3 pipeline = [
4     {"$match": {
5         "price": {"$gte": 2400, "$lte": 4000},
6         "sqft": {"$gte": 850},
7         "$or": [
8             {"amenities": {"$regex": ".*In-Unit Washer & Dryer.*"}},
9             {'laundry': {'$regex': '.*w/d in unit*'}}
10        ],
11         "$or": [
12             {'pets': {'$regex': '.*cats ok*'}},
13             {'Pet Policy': {'$regex': '.*Cats Allowed*'}}
14        ]
15     }},
16 ]
17
18 filtered_res = housing_collection.aggregate(pipeline)
19 for res in filtered_res:
20     print(res)
```

[12] ✓ 0.1s

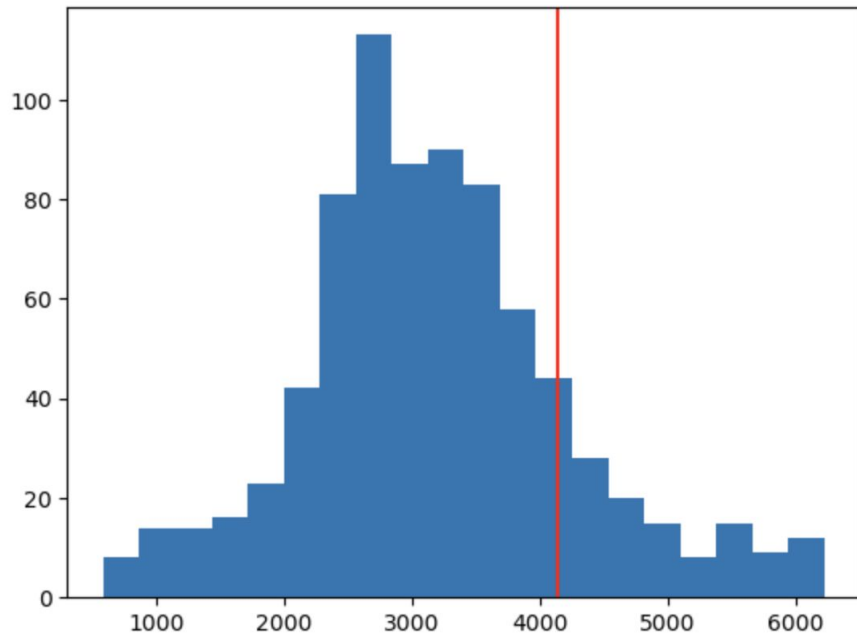
Python

```
... {'_id': ObjectId('648baffb41b4b5c44bc0c309'), 'beds': 2.0, 'baths': 2.0, 'price': 3135.0, 'sqft': 1004.0, 'name': 'La Jolla International C
{'_id': ObjectId('648baffb41b4b5c44bc0c30a'), 'beds': 2.0, 'baths': 2.0, 'price': 3357.5, 'sqft': 1215.0, 'name': 'La Jolla International C
{'_id': ObjectId('648baffb41b4b5c44bc0c30c'), 'beds': 2.0, 'baths': 2.0, 'price': 3135.0, 'sqft': 1004.0, 'name': 'La Jolla International C
{'_id': ObjectId('648baffb41b4b5c44bc0c30d'), 'beds': 2.0, 'baths': 2.0, 'price': 3357.5, 'sqft': 1215.0, 'name': 'La Jolla International C
{'_id': ObjectId('648baffb41b4b5c44bc0c340'), 'beds': 2.0, 'baths': 2.0, 'price': 3260.0, 'sqft': 1010.0, 'name': 'La Scala Apartments', 'C
{'_id': ObjectId('648baffb41b4b5c44bc0c341'), 'beds': 2.0, 'baths': 2.0, 'price': 3290.0, 'sqft': 969.0, 'name': 'La Scala Apartments', 'Cc
{'_id': ObjectId('648baffb41b4b5c44bc0c344'), 'beds': 2.0, 'baths': 2.0, 'price': 3260.0, 'sqft': 1010.0, 'name': 'La Scala Apartments', 'C
{'_id': ObjectId('648baffb41b4b5c44bc0c345'), 'beds': 2.0, 'baths': 2.0, 'price': 3290.0, 'sqft': 969.0, 'name': 'La Scala Apartments', 'Cc
```

# Pricing Distribution Query + Graph

```
1 # Perform the aggregation pipeline
2 pipeline = [
3     {"$group": {"_id": None, "prices": {"$push": "$price"}}},
4     {"$project": {"_id": 0, "prices": 1}},
5     {"$unwind": "$prices"},
6     {"$group": {"_id": "$prices", "count": {"$sum": 1}}},
7     {"$sort": {"_id": 1}}
8 ]
9
10 result = list(housing_collection.aggregate(pipeline))
11
12 prices = [item['_id'] for item in result if item['_id'] is not None]
13 prices = [
14     int(re.match(r"^\$(\d[\d,]*)", price).group(1).replace(',', ''))
15     if isinstance(price, str) else int(price) for price in prices
16 ]
✓ 0.0s
```

Filter out outliers using the interquartile range method



# Speedup improvement

- Save the median, median, and standard deviation in a Redis database so that we can quickly draw up the gaussian distribution without querying all of the data and save one for each postal code.

# Average SQFT and Price

```
1 pipeline = [  
2     {  
3         "$match": {  
4             "beds": 1,  
5             "baths": 1.0,  
6             "sqft": { "$gte": 0 },  
7         }  
8     },  
9     {  
10        "$group": {  
11            "_id": None,  
12            "averageSquareFeet": { "$avg": "$sqft" },  
13            "averagePrice": { "$avg": "$price" }  
14        }  
15    }  
16 ]  
17  
18 run_pipeline = housing_collection.aggregate(pipeline)  
19  
20 for res in run_pipeline:  
21     print(res)  
22
```

✓ 0.1s

```
{'_id': None, 'averageSquareFeet': 698.88995215311, 'averagePrice': 2936.0948813982523}
```

+ Code

+ Markdown

- About 700 square feet on average and \$2,937 per month  
(Price accurate as to July 2022)

# Average SQFT and Price



```
1 pipeline = [  
2     {  
3         "$match": {  
4             "beds": 2,  
5             "baths": 2.0,  
6             "sqft": { "$gte": 0 },  
7         }  
8     },  
9     {  
10        "$group": {  
11            "_id": None,  
12            "averageSquareFeet": { "$avg": "$sqft" },  
13            "averagePrice": { "$avg": "$price" }  
14        }  
15    }  
16 ]  
17  
18 run_pipeline = housing_collection.aggregate(pipeline)  
19  
20 for res in run_pipeline:  
21     print(res)  
22
```

✓ 0.0s

```
{'_id': None, 'averageSquareFeet': 1234.6165413533834, 'averagePrice': 4136.829201101928}
```

- About 1230 square feet on average and \$4,136 per month  
(Price accurate as to July 2022)

The background is a light gray with several decorative orange geometric shapes. There are three small circles: one in the top left, one in the top right, and one in the bottom left. There are also three larger, curved, wedge-like shapes: one in the top left, one in the bottom left, and one in the bottom right. On the far right, there is a large, stylized orange letter 'A' that is partially cut off by the edge of the image.

# Neo4j

# Businesses and Transit

- Create Business and Category nodes
- Add Businesses to Spatial Index
- Similar to creating transit stops

```
1 load_business_query = """CALL apoc.load.json("file:///active_business.json")
2 YIELD value
3 MERGE (b:Business {name: value.gmap_id})
4 SET b.name = value.name
5 SET b.latitude = value.latitude
6 SET b.longitude = value.longitude
7 WITH b, value
8 UNWIND value.category AS cat
9 MERGE (c:Category {name: toLower(cat)})
10 MERGE (b)-[:IS_IN]->(c);
11 """
```

# Add Businesses to spatial index

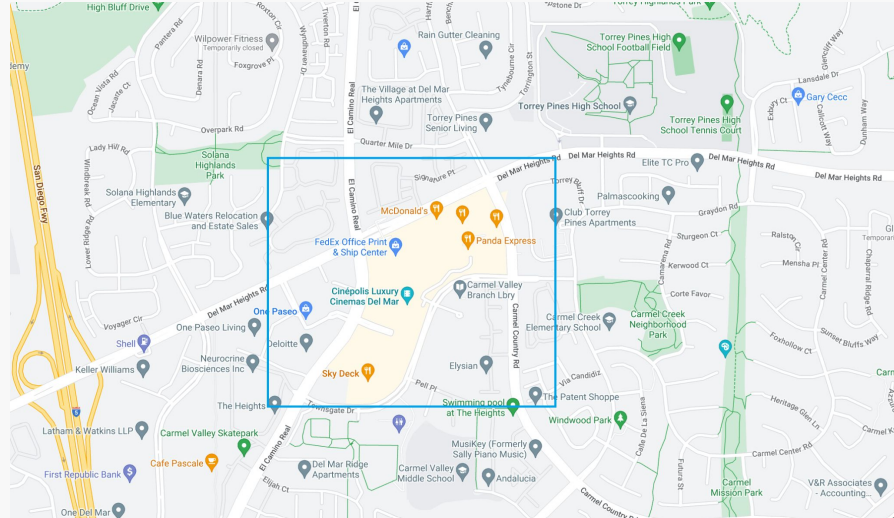
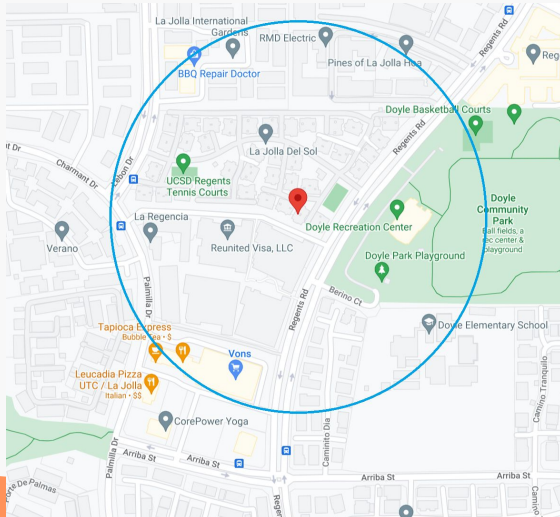
```
run_query("""MERGE (n:Business) with n CALL spatial.addNode('geom', n) YIELD node RETURN node;""")
```



# Neo4J Spatial

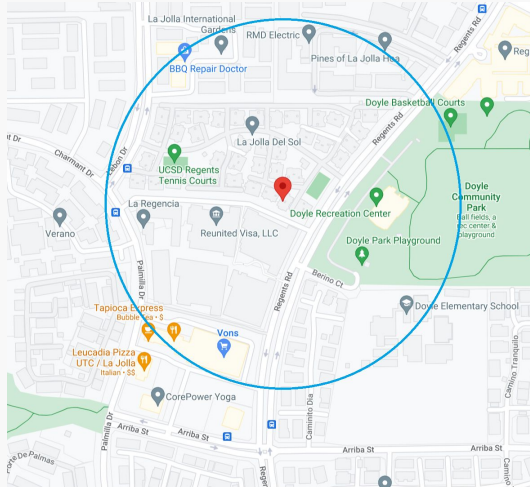
- Allows for finding all nodes within a bounding box
- Allow to find nodes within distance of point

Library [Repo](#)

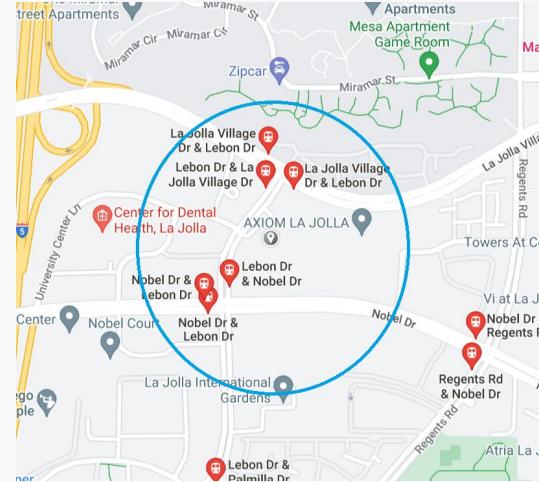


# Queries

Business with optional Category  
within radius of point

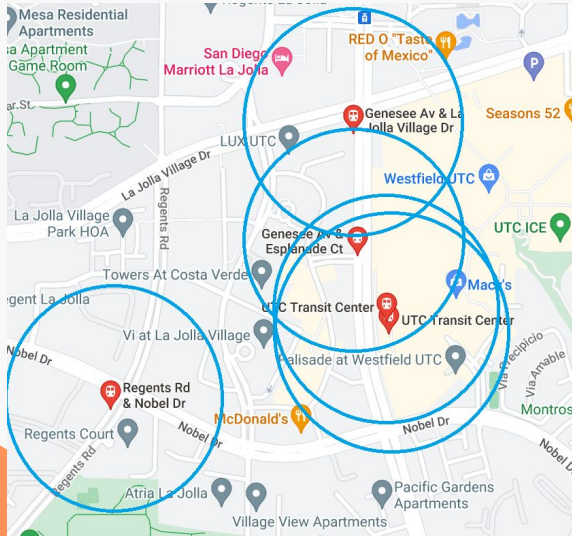


Bus stops within radius of point

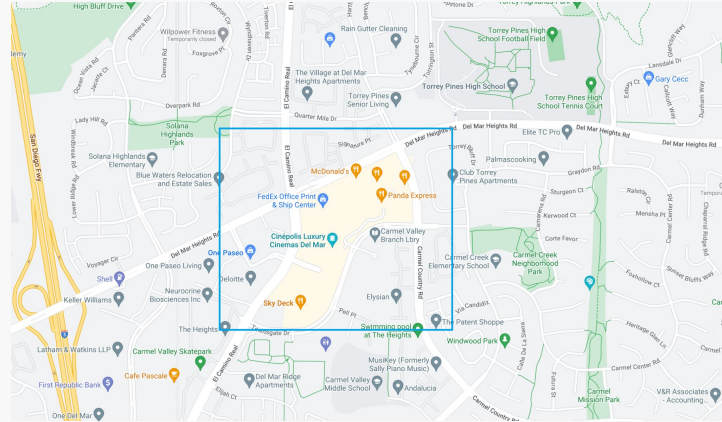


# Queries (Cont)

Businesses with radius of all bus stops on  
a Route



Businesses and/or Bus Stops within  
bounding box



The background features several abstract orange geometric shapes: a curved segment in the top-left, a circle in the top-left, a circle in the top-right, a large 'T' shape in the bottom-left, a circle in the bottom-left, a curved segment in the bottom-right, and a large 'T' shape in the right side.

# Neo4j Demo