



DS-210: PROGRAMMING FOR DATA SCIENCE

LECTURE 24

1. HOW HASH MAPS WORK

2. RUST: HASH MAPS WITH CUSTOM TYPES

3. REPRESENTING GRAPHS





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LAST TIME: HASH MAPS `HashMap<K, V>`

- Mapping
 - from a set of keys (type `K`)
 - to set of values (type `V`)
- Python: dictionaries
- C++: `unordered_map<K, V>`
- Java: `Hashtable<K, T>`





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```
In [2]: use std::collections::HashMap;

let mut crispy_crêpes_café = HashMap::new();
crispy_crêpes_café.insert(String::from("Nutella Crêpe"),5.85);
crispy_crêpes_café.insert(String::from("Strawberries and Nutella Crêpe"),8.75);
crispy_crêpes_café.insert(String::from("Roma Tomato, Pesto and Spinach Crêpe"),8.90);
crispy_crêpes_café.insert(String::from("Three Mashroom Crêpe"),8.90);

fn on_the_menu(cafe: &HashMap<String,f64>, s:String) {
    print!("{: }",s);
    match cafe.get(&s) {
        None => println!("not on the menu"),
        Some(price) => println!("${:.2}",price),
    }
}

on_the_menu(&crispy_crêpes_café, String::from("Four Mashroom Crêpe"));
on_the_menu(&crispy_crêpes_café, String::from("Three Mashroom Crêpe"));
```

```
Four Mashroom Crêpe: not on the menu
Three Mashroom Crêpe: $8.90
```





STORAGE

- Array representing B buckets
- *Hash function* $h : K \rightarrow \{0, 1, \dots, B - 1\}$
 - maps keys in the collection to buckets





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GENERAL IDEAS

- Store keys (and associated values) in buckets
- Searching: go over the entire bucket





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GENERAL IDEAS

- Store keys (and associated values) in buckets
- Searching: go over the entire bucket

COLLISION: TWO KEYS MAPPED TO THE SAME BUCKET

- Make hash function h very random \Rightarrow few collisions
- What to do if two keys in the same bucket





HANDLING COLLISIONS

CHAINING

- Keep collection for items in the same bucket
 - (traditional:) linked list
 - vector
- Search through the collection to find key





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OPEN ADDRESSING (SIMPLEST VERSION)

- Each array entry: (key,value)

Inserting:

- entry $h(k)$ busy: try $h(k) + 1$, $h(k) + 2$, etc.
- insert into first empty



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Searching:

- try $h(k)$, $h(k) + 1$, $h(k) + 2$, etc.
- stop when found or empty entry





GROWING COLLECTION: AMORTIZATION

Example: if number of keys $\geq 0.75B$

- Double B
- Pick new hash function
- Move the information





GROWING COLLECTION: AMORTIZATION

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ADVERSARIAL DATA

- Could create lots of collisions
- Potential basis for *denial of service attacks*





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HASHING WITH CUSTOM TYPES IN RUST

Required for hashing:

1. check if $k_1, k_2 \in K$ equal
2. compute a hash function for elements of K

```
In [3]: struct Point {
        x:f64,
        y:f64,
    }

let point = Point{x:2.3,y:-1.4};

let mut elevation = HashMap::new();

elevation.insert(point,2.3);

elevation.insert(point,2.3);
^^^^^ the trait `Eq` is not implemented for `Point`
elevation.insert(point,2.3);
^^^^^ required by a bound introduced by this call
the trait bound `Point: Eq` is not satisfied

elevation.insert(point,2.3);
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    elevation.insert(point,2.3);
        ^^^^^ the trait `Hash` is not implemented for `Point`
    elevation.insert(point,2.3);
```

Need two traits:

- Eq
- Hash

Default implementation:

```
In [4]: #[derive(Hash,Eq,PartialEq)]
        struct DistanceKM(i64);

    let mut tired = HashMap::new();

    tired.insert(DistanceKM(30),true);
```





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- No value associated with keys
- Just a set of items
- Same implementation





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In [5]: use std::collections::HashSet;

// create
let mut covid = HashSet::new();

// insert values
for i in 2019..=2022 {
    covid.insert(i);
};
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```
In [6]: // iterate over values in the set
for year in &covid {
    print!("{}", year);
}
println!();
```

```
2022 2021 2019 2020
```



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In [7]: covid.get(&2015)
```

```
Out[7]: None
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```

```
In [7]: covid.get(&2015)
```

Out[7]: None

```
In [8]: covid.get(&2021)
```

Out[8]: Some(2021)

```
In [6]: // iterate over values in the set
for year in &covid {
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println!();
```

2022 2021 2019 2020



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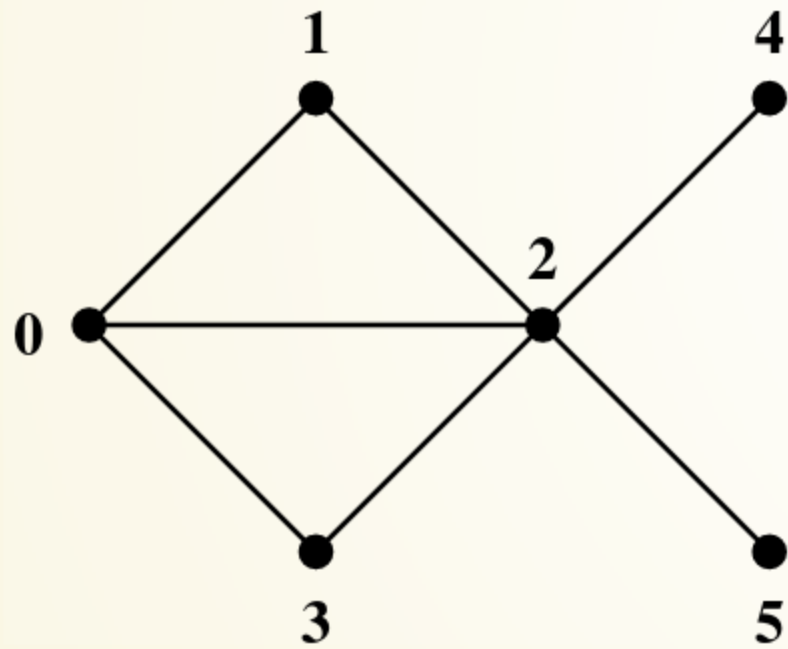
3. REPRESENTING GRAPHS





GRAPH REPRESENTATIONS: VARIOUS OPTIONS

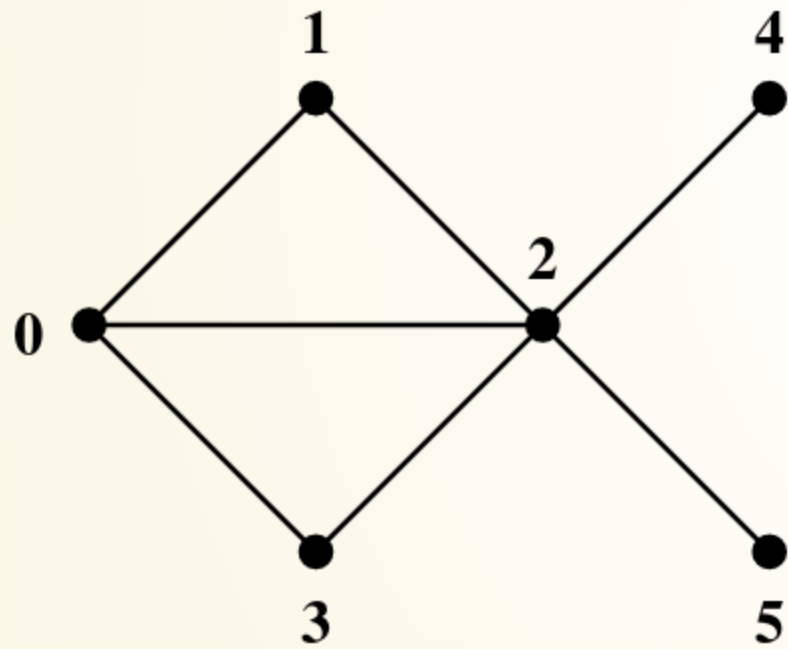
- What information we want to access
- What efficiency required





GRAPH REPRESENTATIONS: VARIOUS OPTIONS

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Today:

- Adjacency lists
- Adjacency matrix

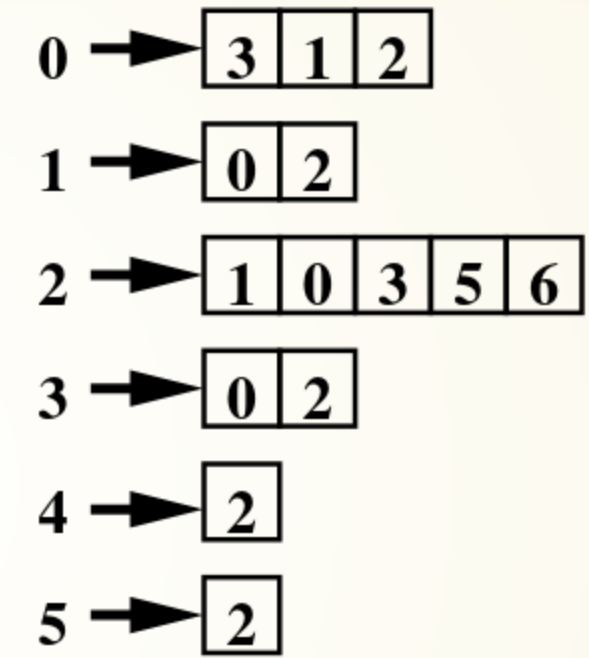
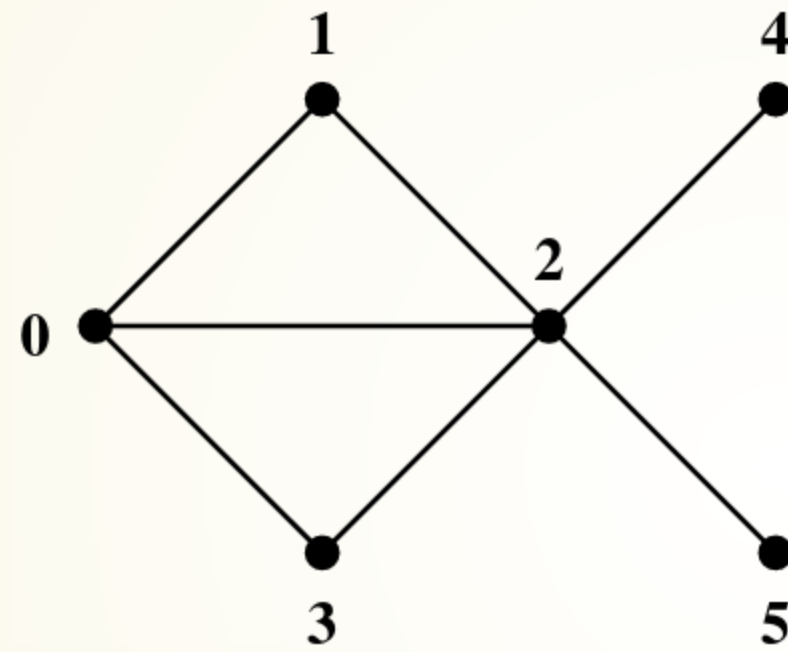
Focus on undirected graphs:

- easy to adjust for directed



ADJACENCY LISTS

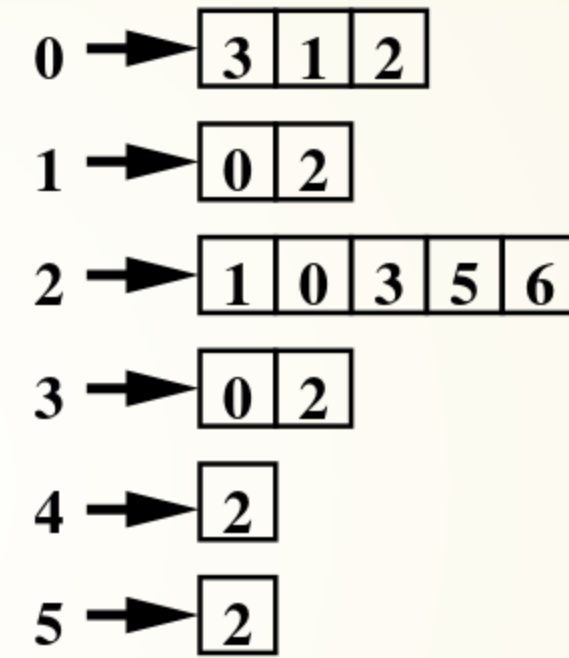
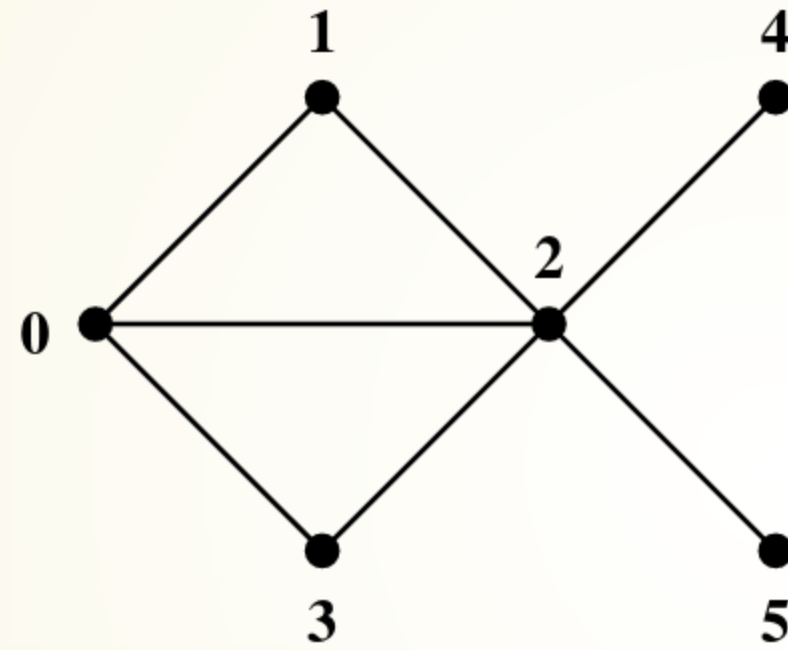
For each vertex, store the list of its neighbors





ADJACENCY LISTS

For each vertex, store the list of its neighbors



Collection:

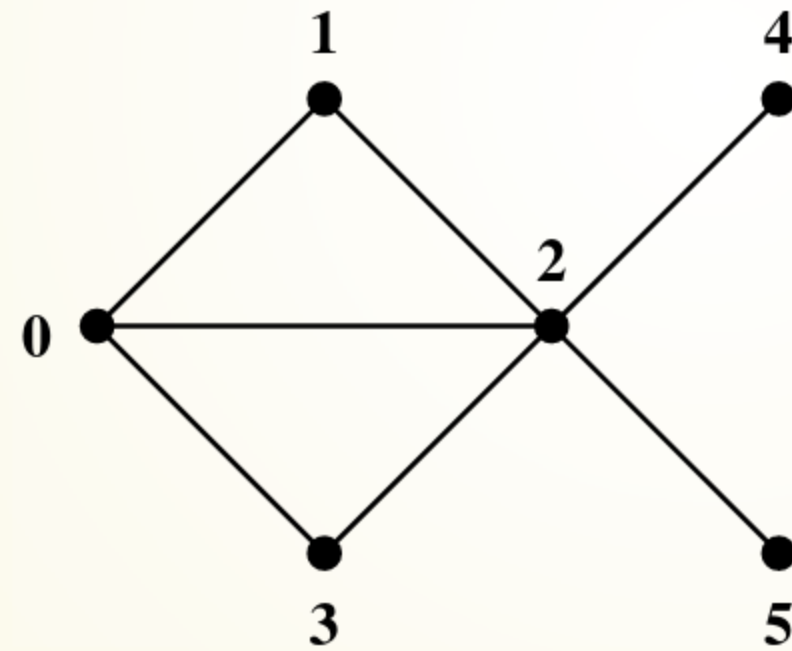
- classical approach: linked list
- vectors





ADJACENCY MATRIX

- n vertices
- $n \times n$ matrix
- For each pair of vertices, store a boolean value: edge present or not



	0	1	2	3	4	5
0		1	1	1	0	0
1	1		1	0	0	0
2	1	1		1	1	1
3	1	0	1		0	0
4	0	0	1	0		0
5	0	0	1	0	0	

