3:00 PM

## Recall from last lecture

- Hash tables expose a vector-like structure to the programmer that accepts non-numeric keys
- When designing a hash table, 3 considerations must be made:
  - How do we efficiently convert from a non-integer into an integer (hashing function)?
  - How do we handle hash collisions (when two items hash to the same number; inevitable)?
  - How full do we allow our hash table to become before resizing (load factor, expressed as a %)
    - Normal vectors can wait until a load factor of 100% before resizing
    - Some hash table implementations cannot be more than 50% full

### Collision Resolution Mechanisms

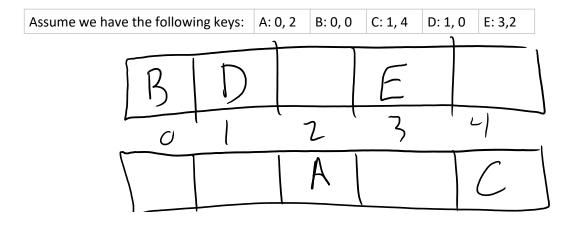
## Approach #1: Open Addressing

- General idea: if the box is full, find another box
- Last lecture we looked at linear probing (look at next box until empty found)
  - Positive: Linear probing allows for 100% load factor (will be slow, however)
  - Negative: Collisions create a clustering effect, increasing the probability of future collisions
- We also looked at quadratic probing (use quadratic formula to find next box)
  - Positive: Less clustering effect, thus tends to require less probes than linear probing
  - Negative: Requires a lot of empty space; more than 50% full means we cannot guarantee that we will find an empty box.
- Next approach: Double Hashing
  - o On collision, use another, different hashing function plus a "salt" to find the next box
  - o Pros and Cons are very similar to quadratic hashing
  - Example hash1(x) =  $x^2 * x + 3$  hash2(y,salt) = 5\*y + 7\*2\*salt + 1;
  - o In Adam's benchmarks, double hashing tends to be the slowest between linear, quadratic, and double

## Modern Approaches to Open Addressing

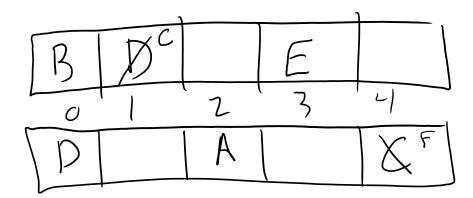
#### **Cuckoo Hashing**

- Invented in 2001
- Came about as a result of advancements in probability theory
- Similar to double hashing but instead utilizes two parallel arrays
- Like double hashing, there are two hashing functions, one for each array
- On an insert, randomly select one of the arrays to place the item in.
  - If something is already there (collision), take its place and force it to find a new home

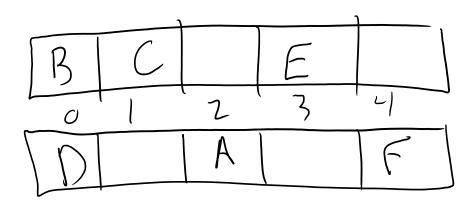


A

• Insert F: 3, 4 (say we randomly picked the 2nd array to insert into)



Final result:

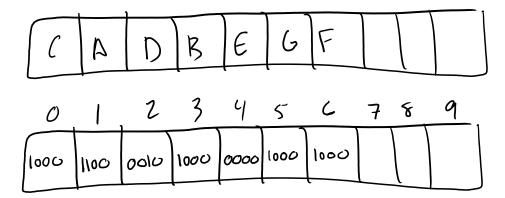


What if instead F went into the first array?

Assume we have the following keys: A: 0, 2 B: 0, 0 C: 1, 4 D: 1, 0 E: 3,2 F: 3,4

## **Hopscotch Hashing**

- First paper published in 2009
- Similar idea to linear probing but it places a max limit on how far an item can be away from its original hash.
  - o In our examples, max distance is up to 3 spaces away
  - Guaranteed O(1). Open question: is the extra bookkeeping worth it?
- Like cuckoo hash tables, hopscotch uses two arrays: one data array and one distance array

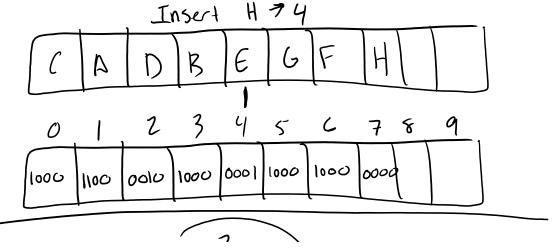


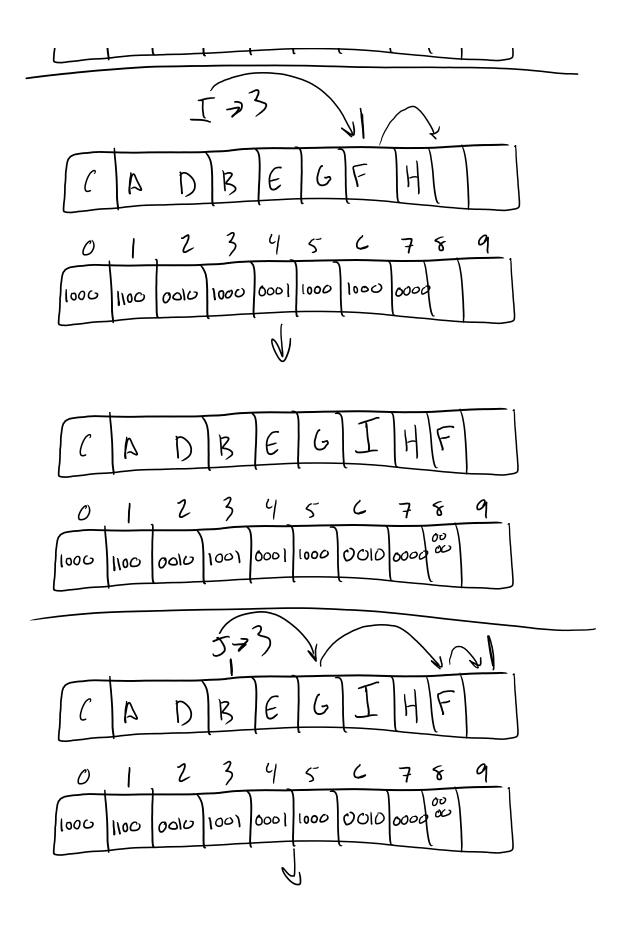
• Bits in 2nd array track "distance from the origin"

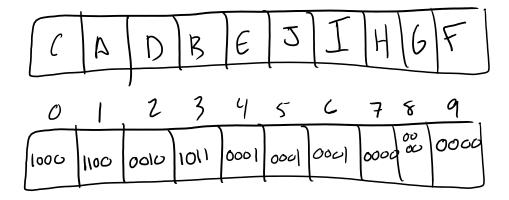
0/1	0/1	0/1	0/1
The item that is presently in the corresponding box hashes to this value		+2 away	+3 away

# Algorithm (from wikipedia)

- 1. If the original hashed box is empty, add to that box. Update bits. **DONE.**
- 2. Otherwise, starting at the hashed value, try to find a box that is empty up to max distance. Update bits box.
- 3. If all boxes up to max distance are occupied, working from first empty box back to the origin, try to move values in other boxes farther if allowable.
- 4. If #3 allows us to make room, we're good. If we get back to the origin and could not find an available slot, resize!

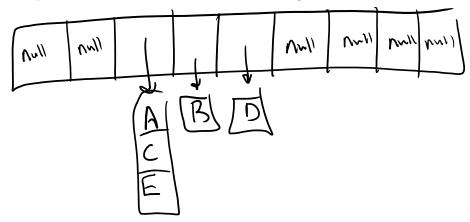






## **Separate Chaining**

- Why do we allow only one value in a given box?
- Why not treat each box as a linear structure (e.g. vector or LL)?



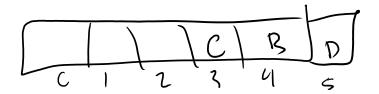
- To add an item, just go to the original hash location, search (linearly) for the item. If it is not there, add to the end. Otherwise, update value.
- At present, the STL unordered\_map uses this technique
- Implications
  - o As buckets get more full, performance becomes more linear
  - o Bucket hash tables can have a load factor greater than 100%

# Key Issue: Removing items from a HT

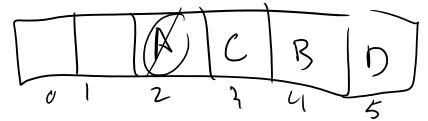
- Consider a linear probing hash table with the following keys:
- A->2, B->4, C->2, D->4



• What happens if we were to remove A?



- Consider, what happens if we try to now retrieve C?
- A "hard delete" ends up ruining the probing algorithm (makes things appear to not be in the table)
- As a workaround, we perform a "soft delete" where we mark the value as having been deleted, but it actually still takes up space



- Items won't actually get removed from the HT until a resize occurs
- · Resizing is also interesting
  - Every time you resize, the hash mod by amount changes. Thus, what once hashed to location 1 may hash to location 20
  - o To solve this, every item in the hash table must be rehashed and replaced.