

# ADS2 — Week 7 Notes & Solutions (Hashing)

Field	Value
Title	ADS2 — Week 7: Hashing (Dictionaries, Chained Hashing, Linear Probing, Hash Functions)
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Sources used	weekplan7.pdf (pp. 1–2); kt.pdf (hashing chapters); slide images hashing-01...10.png
Week plan filename	weekplan7.pdf

## General Methodology and Theory

- **Dictionaries & goal.** Maintain a dynamic set  $S \subseteq U$  with operations SEARCH, INSERT, DELETE in  $O(1)$  expected time using  $O(n)$  space. Store optional satellite data per key.
- **Hashing idea.** Compute an address  $h(x) \in \{0, \dots, m-1\}$  and keep buckets  $A[0 \dots m-1]$ . Need  $h$  that spreads  $S$  “approximately evenly.”
- **Chained hashing.** Each  $A[i]$  stores a (typically singly linked) list. Operations run in  $O(1 + |A[h(x)]|)$ . With load factor  $\alpha = n/m$  and simple-uniform hashing,  $E[|A[h(x)]|] = \alpha$ , so expected  $O(1)$ .
- **Open addressing (linear probing).** Keep a single array of size  $m$ ; collisions are resolved by scanning cyclically until an empty slot is found. Clustering matters; expected time  $\approx O(1/(1-\alpha)^2)$  under simple models.
- **Simple uniform hashing.** For any fixed  $x \neq y$ ,  $\Pr[h(x)=h(y)] = 1/m$ . Yields expected chain length  $1 + (n-1)/m$  for a bucket containing  $x$ .
- **Universal hashing.** Choose  $h$  at random from a family  $H$  with pairwise-independence guarantee:  $\forall x \neq y, \Pr_h[h(x)=h(y)] \leq 1/m$ . Classic families:
  - For prime  $p > |U|$ ,  $h_{\{a,b\}}(x) = ((a \cdot x + b) \bmod p) \bmod m$ , where  $a \in \{1, \dots, p-1\}$ ,  $b \in \{0, \dots, p-1\}$ .
  - Dot-product hashing for large universes: represent  $x$  in base  $m$  as vector and use  $h_a(x) = (a \cdot x) \bmod m$ .
- **Deletion rules.**
  - Chaining: remove node from its list.
  - Linear probing: deletion must **reinsert** the following cluster or use a **DELETED** tombstone to preserve successful searches.

**Core invariants.** (i) Every stored key is reachable by SEARCH; (ii) No duplicates; (iii)  $\alpha$  stays in a target band via resize (e.g.,  $m$  doubles/halves at thresholds).

### Pseudocode skeletons.

```
Algorithm: chained_insert
Input: table  $A[0..m-1]$ , hash  $h(\cdot)$ , key  $x$ 
```

Output: A with x inserted if absent

```
i ← h(x)
if x ∈ A[i]: return
prepend x to list A[i]
// Time: O(1 + |A[i]|); Space: O(1)
```

Algorithm: linear\_probe\_search

Input: array A[0..m-1] (⊥ for empty, ⬢ for tombstone), hash h, key x

Output: index j with A[j]=x or ⊥ if absent

```
for k = 0..m-1:
  j ← (h(x)+k) mod m
  if A[j] = ⊥: return ⊥
  if A[j] = x: return j
return ⊥
// Time: O(cluster length)
```

## Notes (slides-first; compact)

Topics match the 10 slide images (hashing-01...10.png): dictionaries; chained hashing (idea, ops, time, space); linear probing (ops, time/variants); hash functions; simple-uniform hashing (indicator-variable proof); universal hashing (lemmas, families, dot-product hashing; theorem:  $O(n)$  space,  $O(1)$  expected time/op). Use these images for visual walk-throughs and in-class examples.

**Key takeaways.** - With **chaining + simple-uniform hashing** and  $m = \Theta(n)$ , all three operations run in expected  $O(1)$ . - **Linear probing** is cache-friendly but sensitive to clustering; keep  $\alpha \leq \sim 0.7$  and resize. - **Universal hashing** provides collision bounds independent of  $S$ ; pick  $h$  at operation start or per table resize.

## Coverage Table (enumerated from weekplan7.pdf)

Due to poor text extraction (fonts without spaces), we apply the *scanned/low-text fallback*. The plan lists seven numbered tasks under “Exercises/Problems”. We enumerate them conservatively; if any label is off, replace the Title/Label with the exact line from the plan and we will re-align.

Weekplan ID	Canonical ID	Title/Label (verbatim if readable)	Assignment Source	Text Source	Status
1	—	Chained hashing: build table & basic ops	weekplan7.pdf p.1	hashing-03.png, hashing-04.png	Solved

Weekplan ID	Canonical ID	Title/Label (verbatim if readable)	Assignment Source	Text Source	Status
2	—	Chained hashing: time & space; expected bucket length	weekplan7.pdf p.1	hashing-05.png, hashing-09.png	Solved
3	—	Linear probing: insert/search trace	weekplan7.pdf p.1	hashing-06.png, hashing-08.png	Solved
4	—	Lazy deletion in linear probing	weekplan7.pdf p.2	hashing-08.png	Solved
5	—	Simple uniform hashing: indicator-variable proof	weekplan7.pdf p.2	hashing-09.png	Solved
6	—	Universal hashing: family & collision bound	weekplan7.pdf p.2	hashing-10.png; kt.pdf	Solved
7	—	<b>Puzzle:</b> “Billy & the carrots” (expected visits)	weekplan7.pdf p.2	—	BLOCKER

**MISMATCH/Blockers.** If the plan has additional or differently worded items, paste their exact lines (or a screenshot of the exercise block) and we will update the Coverage Table. For Item 7 we need the precise statement (parameters such as number of bushes, carrot placement model, with/without replacement) to finalize the expectation.

## Solutions

Slides-first; textbook variants (KT) are noted where helpful.

### Exercise 1 — Chained hashing: build table & basic ops

**Assignment Source:** weekplan7.pdf p.1

**Text Source:** hashing-03/04.png (insertion demo)

- **Setup.** Let  $m=10$  and  $h(x)=x \bmod 10$ ; insert  $S=\{1,16,41,54,66,96\}$  (from slide). Place each in  $A[h(x)]$ .
- **Trace.**  $A[1]: 1, 41 \rightarrow 1 \rightarrow 41$ ;  $A[6]: 16, 66, 96 \rightarrow 16 \rightarrow 66 \rightarrow 96$ ;  $A[4]: 54$ . Other buckets empty. Prepend vs append does not affect correctness; slides use prepend.
- **Ops.**
  - SEARCH(41): compute  $h=1$ , scan list ( $1 \rightarrow 41$ )  $\rightarrow$  found.
  - INSERT(16): already present  $\rightarrow$  no-op.
  - DELETE(66): remove from  $A[6]$  list.
- **Verification.** Invariants preserved; other buckets unchanged.

✓ **Answer:** Final chaining table has lists  $A[1]=[41,1]$ ,  $A[4]=[54]$ ,  $A[6]=[96,16]$  (assuming prepend on insert) and others empty.

**Alternative (KT).** Any list order is valid; expected list size per slot is  $\alpha = n/m$ .

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### Exercise 2 — Chained hashing: time & expected bucket length

**Assignment Source:** weekplan7.pdf p.1

**Text Source:** hashing-05.png, hashing-09.png

- **Claim.** Under simple-uniform hashing and  $\alpha=n/m$ , expected list length at the slot of a fixed key  $x$  is  $1+(n-1)/m$ .
- **Proof (indicators).** Let  $I_y=1$  if  $h(y)=h(x)$ , 0 otherwise. Then  $|A[h(x)]| = \sum_{y \in S} I_y$ . For  $y=x$ ,  $I_x=1$ . For  $y \neq x$ ,  $E[I_y] = \Pr[h(y)=h(x)] = 1/m$ . Thus  $E[|A[h(x)]|] = 1 + (n-1) \cdot (1/m) = 1 + (n-1)/m$ .
- **Complexity.** Expected SEARCH/INSERT/DELETE in  $O(1+\alpha)$ ; with  $m=\Theta(n)$ , this is  $O(1)$ .

✓ **Answer:**  $E[|A[h(x)]|] = 1 + (n-1)/m$  and operations run in expected  $O(1+\alpha)$ .

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### Exercise 3 — Linear probing: insert/search trace

**Assignment Source:** weekplan7.pdf p.1

**Text Source:** hashing-06.png (ops), hashing-08.png (time/variants)

- **Setup.**  $m=10$ ,  $h(x)=x \bmod 10$ . Insert sequence  $[41,1,13,54,98]$  (from slide). Buckets initially empty.
- **Trace.**
  - $41 \rightarrow A[1]=41$ .
  - $1 \rightarrow A[1]$  occupied  $\rightarrow$  probe to  $A[2]=1$ .
  - $13 \rightarrow A[3]=13$ .
  - $54 \rightarrow A[4]=54$ .
  - $98 \rightarrow A[8]=98$ .
- **Search rule.** Starting at  $A[h(x)]$ , scan right cyclically until  $\perp$  or  $x$  is found.
- **Verification.** Cluster is the consecutive non-empty run starting at  $A[1]$ .

✓ **Answer:** Final array (indices 0..9):  $[\perp, 41, 1, 13, 54, \perp, \perp, \perp, 98, \perp]$ . SEARCH uses linear scan within the cluster.

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### Exercise 4 — Lazy deletion in linear probing

**Assignment Source:** weekplan7.pdf p.2

**Text Source:** hashing-08.png

- **Why tombstones.** Removing an interior key breaks searches for later keys in the same cluster. Use a special value  $\diamond$  (DELETED) that is treated as occupied during SEARCH and as empty during INSERT.
- **Procedure.** On DELETE( $x$ ): find  $j$  by linear\_probe\_search; if found, set  $A[j] \leftarrow \diamond$ . Optionally rebuild when tombstone count exceeds a threshold to keep performance.

✓ **Answer:** Correctness preserved because subsequent keys remain reachable through  $\diamond$ ; periodic rebuild restores probe lengths.

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### Exercise 5 — Simple uniform hashing: indicator-variable proof

**Assignment Source:** weekplan7.pdf p.2

**Text Source:** hashing-09.png

- **Goal.** Show expected chain length equals  $1 + (n-1)/m$  (detail in Ex. 2) and hence expected  $O(1)$  per operation when  $\alpha = \Theta(1)$ .
- **Method.** Indicator variables; linearity of expectation; no independence beyond pairwise collision bound needed.

✓ **Answer:** Expected chain length  $1 + (n-1)/m$ ; expected time  $O(1 + \alpha)$ .

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### Exercise 6 — Universal hashing: family & collision bound

**Assignment Source:** weekplan7.pdf p.2

**Text Source:** hashing-10.png; kt.pdf

- **Family.** For prime  $p > |U|$ , define  $H = \{ h_{a,b}(x) = ((a \cdot x + b) \bmod p) \bmod m \}$  with  $a \in \{1, \dots, p-1\}$ ,  $b \in \{0, \dots, p-1\}$ .
- **Property.** For any  $x \neq y$ ,  $\Pr_{a,b}[h_{a,b}(x) = h_{a,b}(y)] \leq 1/m$ .
- **Sketch.** Over  $\mathbb{Z}_p$ ,  $(a \cdot x + b) \equiv (a \cdot y + b) \Leftrightarrow a(x - y) \equiv 0 \Rightarrow a \equiv 0$  (forbidden) unless  $x \equiv y$ ; for fixed  $(x, y)$ , at most one  $b$  matches per  $a$ , giving  $\leq 1/p$ ; reduction mod  $m$  preserves  $\leq 1/m$  when  $m \leq p$ .
- **Practice.** Choose  $a, b$  uniformly on (re)build; guarantees expected  $O(1)$  per op independent of input  $S$ .

✓ **Answer:** The family above is universal; collision probability  $\leq 1/m$ ; with  $m = \Theta(n)$  we obtain  $O(1)$  expected per operation.

**Alternative (dot product).** Represent  $x$  in base  $m$  as vector and use  $h_a(x) = (a \cdot x) \bmod m$ ;  $H$  is universal (slides).

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### Exercise 7 — Puzzle: “Billy & the carrots”

**Assignment Source:** weekplan7.pdf p.2

**Text Source:** — (needs exact statement)

- **BLOCKER — need the precise model.** The plan mentions Billy “might go to the same bush again in the next round.” To compute  $E[\text{visits until three carrots}]$ , we must know: 1) number of bushes  $B$ ; 2) how many bushes contain carrots (exactly 3, or each has probability  $p$  of having a carrot per visit?); 3) with/without replacement after finding a carrot; 4) whether Billy avoids revisiting successful bushes.
- **If** each visit is an independent Bernoulli( $p$ ) success and carrots are unlimited, then  $E[T \text{ to 3 successes}] = 3/p$  (negative binomial).
- **If** exactly three distinct bushes hide carrots among  $B$  and Billy samples bushes **with replacement**, the process is a coupon-collector variant; expected time depends on revisits and

equals  $\sum_{i=0}^2 1/(3-i)/(B)$  after successful-bush avoidance. Please paste the exact statement to finalize.

✓ **Answer:** Pending exact statement; see cases above.

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## Puzzle (pick-one for practice)

**Design a universal family.** For 32-bit integers and table size  $m=2^k$  ( $k \leq 16$ ), propose a fast  $h(x)$ .

**Hint:** multiply-shift: choose odd 32-bit  $A$  uniformly; return  $(A \cdot x) \gg (32-k)$ . This is 2-universal and branch-free.

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## Summary

- **What to use when.**
- Use **chaining** when you want simple deletion and predictable  $O(1+\alpha)$  behavior.
- Use **linear probing** for cache locality; keep  $\alpha$  low and rebuild when tombstones accumulate.
- Use **universal hashing** (e.g., multiply-shift or  $ax+b \bmod p$ ) to decouple performance from adversarial  $S$ .
- **Resize policy.** Maintain  $\alpha$  in  $[0.5, 0.75]$ ; double/halve  $m$  and rehash with a fresh  $h$ .
- **Notation recap.**  $\alpha=n/m$  (load factor);  $\delta$  (delta) bottleneck when used in flows (not here);  $U$  universe;  $S$  stored set.

**Next actions.** Paste a screenshot of the exercise block in weekplan7.pdf so we can lock exact labels/IDs and finalize Exercise 7.