Part 4: Join Algorithms

Joins

- * Three main kinds (our focus)
 - * cross product (or cross joins)
 - * equality joins
 - * inequality joins
- * Several special joins
 - * outer joins
 - * joins to handle special situations
 - * correlated subqueries, exist construct, etc.

The Nested Loop Join

- * The fallback algorithm, analogous to scanning the table for WHERE condition
- * Must have "tool" in the join algorithm tool box

Block Nested Loop

- ♦ Let's say we are joining relation R and C: R⋈S
- For Each block, B_R of R
 - * read the block B_R
 - * For Each block, B_S of S
 - * read the block Bs
 - * for each row r in B_R
 - * for each row s in Bs
 - * if r joins with s then put r⋈s in output buffer
 - * if (output buffer full) then flush it

```
R
[ 28, 7, 1, 13]
[ 7, 25, 24, 17]
[19, 6, 22, 4]
[ 8, 4, 20, 16]
[ 18, 19, 11, 29]
S
[ 26, 20, 8, 8]
[ 3, 22, 1, 23]
[ 15, 12, 17, 13]
[10, 11, 5, 1]
[ 0, 21, 15, 16]
[ 24, 14, 14, 16]
[ 3, 17, 11, 17]
[ 7, 10, 29, 3]
```

```
* In Memory
R
                    * In Memory
                                        Bring a block of S
                    * Bring a block of R
[ 28, 7, 1, 13]
  7, 25, 24, 17] [ 28, 7, 1, 13] [ 26, 20, 8, 8]
 19, 6, 22, 4]
                                        * Join the two blocks of rows
 8, 4, 20, 16]
                                        No matches (in this case)
 18, 19, 11, 29]
                                        Bring next block of S
                                                                * Output rows
                                        [ 3, 22, 1, 23]
S
                                                                   [(1,1)]
                                        * Join the two blocks of rows
[ 26, 20, 8, 8]
                                        * [1,1] is a match, output
  3, 22, 1, 23]
                                        Bring next block of S
 15, 12, 17, 13]
                                        [ 15, 12, 17, 13]
 10, 11, 5, 1]
  0, 21, 15, 16]
                                                                   [(1,1),
                                        * Join the two blocks of rows
 24, 14, 14, 16]
                                                                    (13,13)
                                        * [13,13] is a match, output
[ 3, 17, 11, 17]
                                        Bring next block of S
  7, 10, 29, 3]
```

```
In MemoryOutput rows
R
                 * In Memory
                                   Bring blocks of S
                 * Bring a block of R
[ 28, 7, 1, 13]
[ 7, 25, 24, 17] [ 28, 7, 1, 13] [ 26, 20, 8, 8]
                                   [ 3, 22, 1, 23]
[19, 6, 22, 4]
                                                      [(1,1)]
[ 8, 4, 20, 16]
                                   [ 15, 12, 17, 13]
                                                      [(1,1),(13,13)]
[ 18, 19, 11, 29]
                                   [10, 11, 5, 1]
S
[ 26, 20, 8, 8]
                                   [ 0, 21, 15, 16]
[ 3, 22, 1, 23]
                                   [ 24, 14, 14, 16]
[ 15, 12, 17, 13]
                                   [ 3, 17, 11, 17]
[10, 11, 5, 1]
                                   [7, 10, 29, 3] [(1,1), (13,13),
[ 0, 21, 15, 16]
[ 24, 14, 14, 16]
                                                     (1,1),(7,7)
[ 3, 17, 11, 17]
[ 7, 10, 29, 3]
                   7, 25, 24, 17]
```

```
R
                   In MemoryIn Memory
                                                            * Output rows

    Bring next block of R * Bring blocks of S

[ 28, 7, 1, 13]
[ 7, 25, 24, 17] [ 7, 25, 24, 17] [ 26, 20, 8, 8]
                                     [ 3, 22, 1, 23]
[19, 6, 22, 4]
                                     [ 15, 12, 17, 13] [(1,1),(13,13),(1,1),(7,7)]
[ 8, 4, 20, 16]
                                                         [(17,17)]
[ 18, 19, 11, 29]
                                     [10, 11, 5, 1]
                                     [ 0, 21, 15, 16]
S
                                     [ 24, 14, 14, 16] [(1,1),(13,13),(1,1),(7,7)]
                                                         [(17,17),(24,24)]
[ 26, 20, 8, 8]
[ 3, 22, 1, 23]
                                                        [(1,1),(13,13),(1,1),(7,7)]
                                     [ 3, 17, 11, 17]
                                                         [(17,17),(24,24),
[ 15, 12, 17, 13]
                                                         (17,17),(17,17)
[10, 11, 5, 1]
                                                        [(1,1),(13,13),(1,1),(7,7)]
[ 0, 21, 15, 16]
                                     [ 7, 10, 29, 3]
                                                        [(17,17),(24,24),(17,17),
[ 24, 14, 14, 16]
                                                                      (17,17)
                                                         [(7,7)]
[ 3, 17, 11, 17]
[ 7, 10, 29, 3]
```

I/O costs?

- * How many times did we read relation R?
- * How many times did we read relation S?

RMS

```
In MemoryIn Memory
                                                        Output rows
R

    Bring a block of R
    Bring blocks of S

[ 28, 7, 1, 13] [ 28, 7, 1, 13] [ 26, 20, 8, 8]
[ 7, 25, 24, 17] [ 7, 25, 24, 17] [ 3, 22, 1, 23] [(1,1)]
[19, 6, 22, 4]
                                     [ 15, 12, 17, 13] [(1,1),(13,13),
[ 8, 4, 20, 16]
                                                         (17,17)
[ 18, 19, 11, 29]
                                     [10, 11, 5, 1] [(1,1), (13,13),
                                                        (17,17),(1,1)
S
                                     [ 0, 21, 15, 16] [(1,1),(13,13),(17,17),(1,1)] [ 24, 14, 14, 16] [(24,24)]
[ 26, 20, 8, 8]
[ 3, 22, 1, 23]
                                     [ 3, 17, 11, 17][(1,1),(13,13),(17,17),(1,1)]
                                                        [(24,24),(17,17),
[ 15, 12, 17, 13]
                                                        (17,17)
[10, 11, 5, 1]
[ 0, 21, 15, 16]
                                     [ 7, 10, 29, 3][(1,1),(13,13),(17,17),(1,1)]
                                                        [(24,24),(17,17),
[ 24, 14, 14, 16]
                                                        (17,17),(7,7)
[ 3, 17, 11, 17]
                                                        [(7,7)]
[ 7, 10, 29, 3]
```

Block Nested Loop - Cost

- * Let |R|, |S| be number of pages in R, S respectively
- * If fraction f of R fits in memory, we need to fetch S, 1/f times
 - * if all of R fits in memory then we only need to read both just once!
- * Which relation should be outer?
- * Still a lot of CPU cost

Equality=Inner=Natural Join

- * Most joins (e.g. PK-FK) are equality joins
- Several algorithms to handle the equality join

Hash Joins

- * In block nested loop join, we could build a hash table on the outer table for fast equality search
- * Still same amount of I/O = |R| + |S|/f
- * But lot less CPU processing
- * Can we do better?

R M S using Hash Join

```
    In Memory
    In Memory

                                                          Output rows
R

    Bring a block of R
    Bring blocks of S

[ 28, 7, 1, 13] [ 28, 7, 1, 13] [ 26, 20, 8, 8]
[ 7, 25, 24, 17]
[ 19, 6, 22, 4] [ 7, 25, 24, 17] [ 3, 22, 1, 23] [(1,1)]
                                        [ 15, 12, 17, 13] [(1,1),(13,13),
[ 8, 4, 20, 16] \xrightarrow{24} 1 \xrightarrow{1} 17 \xrightarrow{25}
                                                       (17,17)
[ 18, 19, 11, 29] }
                                        [10, 11, 5, 1] [(1,1), (13,13),
                                                         (17,17),(1,1)
                       →28
S
                                       [ 0, 21, 15, 16]<sub>[(1,1),(13,13),(17,17),(1,1)]</sub>
[ 24, 14, 14, 16]<sub>[(24,24)]</sub>
[ 26, 20, 8, 8]
[ 3, 22, 1, 23]
                                        [ 3, 17, 11, 17][(1,1),(13,13),(17,17),(1,1)]
[ 15, 12, 17, 13]
                                                            [(24,24),(17,17),
                                                            (17,17)
[10, 11, 5, 1]
                                        [ 7, 10, 29, 3][(1,1),(13,13),(17,17),(1,1)]
[ 0, 21, 15, 16]
                                                            [(24,24),(17,17),
[ 24, 14, 14, 16]
                                                            (17,17),(7,7)
[ 3, 17, 11, 17]
                                                            [(7,7)]
[ 7, 10, 29, 3]
```

Hash Join: Grace

- * We can partition both R and S using hashing so that each partition of R would fit in memory
- * Two I/O (read+write) of R & S for partitioning
- * One scan of R & S for joining
- Make partition size small enough to minimize memory overflow issues

```
S
[ 26, 20, 8, 8]
                         B0:[]
[ 3, 22, 1, 23]
                         B1:[]
[ 15, 12, 17, 13]
                         B2:[]
[10, 11, 5, 1]
                         B3:[]
                         B4:[]
[ 0, 21, 15, 16]
[ 24, 14, 14, 16]
                         B5:[]
                         B6:[]
[ 3, 17, 11, 17]
[ 7, 10, 29, 3]
                         B7:[]
```

```
S
[ 26, 20, 8, 8]
                         B0:[]
[ 3, 22, 1, 23]
                         B1:[]
[ 15, 12, 17, 13]
                         B2: [ 26]
[10, 11, 5, 1]
                         B3:[]
                         B4:[]
[ 0, 21, 15, 16]
[ 24, 14, 14, 16]
                        B5:[]
                         B6:[]
[ 3, 17, 11, 17]
[ 7, 10, 29, 3]
                         B7:[]
```

```
S
[ 26, 20, 8, 8]
                         B0:[]
[ 3, 22, 1, 23]
                         B1:[]
[ 15, 12, 17, 13]
                         B2: [ 26]
[10, 11, 5, 1]
                         B3:[]
                        B4: [ 20]
[ 0, 21, 15, 16]
[ 24, 14, 14, 16]
                         B5:[]
[ 3, 17, 11, 17]
                         B6:[]
[ 7, 10, 29, 3]
                         B7:[]
```

```
S
                        B0:[8]
[ 26, 20, 8, 8]
[ 3, 22, 1, 23]
                        B1:[]
[ 15, 12, 17, 13]
                        B2:[ 26]
[ 10, 11, 5, 1]
                        B3:[]
                        B4: [ 20]
[ 0, 21, 15, 16]
[ 24, 14, 14, 16]
                        B5:[]
[ 3, 17, 11, 17]
                        B6:[]
[ 7, 10, 29, 3]
                        B7:[]
```

```
S
                        B0:[ 8, 8]
[ 26, 20, 8, 8]
[ 3, 22, 1, 23]
                        B1:[]
[ 15, 12, 17, 13]
                        B2:[ 26]
[ 10, 11, 5, 1]
                        B3:[]
                     B4: [ 20]
[ 0, 21, 15, 16]
[ 24, 14, 14, 16]
                       B5:[]
                     B6:[]
[ 3, 17, 11, 17]
[ 7, 10, 29, 3]
                       B7:[]
```

```
S
                       B0:[ 8, 8]
[ 26, 20, 8, 8]
[ 3, 22, 1, 23]
                        B1:[]
[ 15, 12, 17, 13]
                        B2:[ 26]
                       B3:[ 3]
[ 10, 11, 5, 1]
                     B4: [ 20]
[ 0, 21, 15, 16]
[ 24, 14, 14, 16]
                    B5:[]
                     B6:[]
[ 3, 17, 11, 17]
[ 7, 10, 29, 3]
                       B7:[]
```

```
S
                       B0:[ 8, 8]
[ 26, 20, 8, 8]
[ 3, 22, 1, 23]
                       B1:[]
[ 15, 12, 17, 13]
                       B2:[ 26]
                       B3:[ 3]
[ 10, 11, 5, 1]
[ 0, 21, 15, 16]
                     B4: [ 20]
[ 24, 14, 14, 16]
                    B5:[]
                    B6: [ 22]
[ 3, 17, 11, 17]
[ 7, 10, 29, 3]
                       B7:[]
```

```
S
[ 26, 20, 8, 8]
 3, 22, 1, 23]
[ 15, 12, 17, 13]
[ 10, 11, 5, 1]
[ 0, 21, 15, 16] B4: [ 20, 12]
[ 24, 14, 14, 16] B5:[ 13, 5, 21]
[ 3, 17, 11, 17]
[ 7, 10, 29, 3]
```

```
B0:[ 8, 8, 0, 16]
     B1: [ 1, 17, 1]
     B2: [ 26, 10]
B3:[ 3, 11]
 B6: [ 22]
     B7: [ 23, 15, 15]
```

- * Assuming page size = 4
- * B0 is full when we process 16
- * B0 is written to disk

```
S
[ 26, 20, 8, 8]
 3, 22, 1, 23]
[ 15, 12, 17, 13]
[ 10, 11, 5, 1]
[ 0, 21, 15, 16] B4: [ 20, 12]
[ 24, 14, 14, 16] B5:[ 13, 5, 21]
[ 3, 17, 11, 17]
[ 7, 10, 29, 3]
```

```
B0: [ 24, 16]
     B1: [ 1, 17, 1, 17]
     B2: [ 26, 10]
B3:[ 3, 11, 3]
B6: [ 22, 14, 14]
     B7: [ 23, 15, 15]
```

- * Assuming page size = 4
- * B1 is full when we process 17
- * B1 is written to disk

```
S
[ 26, 20, 8, 8]
[ 3, 22, 1, 23]
[ 15, 12, 17, 13]
[ 10, 11, 5, 1]
[ 0, 21, 15, 16] B4: [ 20, 12]
[ 24, 14, 14, 16] B5:[ 13, 5, 21]
[ 3, 17, 11, 17] B6: [ 22, 14, 14]
[ 7, 10, 29, 3]
```

```
B0: [ 24, 16]
    B1:[]
    B2: [ 26, 10]
   B3: [ 3, 11, 3, 11]
B7: [ 23, 15, 15]
```

- * Assuming page size = 4
- * B3 is full when we process 11
- * B3 is written to disk

```
S
[ 26, 20, 8, 8]
[ 3, 22, 1, 23]
[ 15, 12, 17, 13]
[ 10, 11, 5, 1]
[ 0, 21, 15, 16] B4: [ 20, 12]
[ 24, 14, 14, 16] B5:[ 13, 5, 21]
[ 3, 17, 11, 17] B6: [ 22, 14, 14]
[ 7, 10, 29, 3]
```

```
B0: [ 24, 16]
    B1:[]
    B2: [ 26, 10]
    B3:[]
B7: [ 23, 15, 15]
```

- * Assuming page size = 4
- * B3 is full when we process 11
- * B3 is written to disk

```
S
[ 26, 20, 8, 8]
[ 3, 22, 1, 23]
[ 15, 12, 17, 13]
[ 10, 11, 5, 1]
[ 0, 21, 15, 16] B4: [ 20, 12]
[ 24, 14, 14, 16] B5:[ 13, 5, 21]
[ 3, 17, 11, 17] B6: [ 22, 14, 14]
[ 7, 10, 29, 3]
```

```
B0: [ 24, 16]
B1: [ 17]
B2: [ 26, 10]
B3:[]
B7: [ 23, 15, 15, 7]
```

- * Assuming page size = 4
- * B7 is full when we process 7
- * B7 is written to disk

```
S
[ 26, 20, 8, 8]
 3, 22, 1, 23]
[ 15, 12, 17, 13]
[ 10, 11, 5, 1]
[ 0, 21, 15, 16] B4: [ 20, 12]
[ 3, 17, 11, 17]
[ 7, 10, 29, 3]
```

```
B0: [ 24, 16]
                        B1: [ 17]
                        B2: [ 26, 10, 10]
                        B3:[]
[ 24, 14, 14, 16] B5:[ 13, 5, 21, 29]
                    B6: [ 22, 14, 14]
                        B7:[]
```

- * Assuming page size = 4
- * B5 is full when we process 29
- * B5 is written to disk

```
S
[ 26, 20, 8, 8]
 3, 22, 1, 23]
[ 15, 12, 17, 13]
[ 10, 11, 5, 1]
[ 0, 21, 15, 16] B4: [ 20, 12]
[ 24, 14, 14, 16]
[ 3, 17, 11, 17] B6: [ 22, 14, 14]
[ 7, 10, 29, 3]
```

```
B0: [ 24, 16]
       B1: [ 17]
       B2: [ 26, 10, 10]
      B3:[]
B5:[]
       B7:[]
```

- * Assuming page size = 4
- * B5 is full when we process 29
- * B5 is written to disk

Hash Partitioning

Hash Partitioning

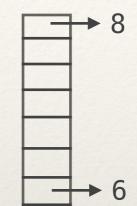
R M S using Grace Hash Join

```
R
                 Partitioned R
[ 28, 7, 1, 13] P0: [ 24, 8, 16]
[ 7, 25, 24, 17] P1:[ 1, 25, 17]
[ 19, 6, 22, 4] P2:[ 18]
[ 8, 4, 20, 16] P3: [ 19, 19, 11]
[ 18, 19, 11, 29] P4: [ 28, 4, 4, 20]
                  P5: [ 13, 29]
                  P6: [ 6, 22]
                  P7:[ 7, 7]
S
                 Partitioned S
[ 26, 20, 8, 8]
                 P0: [ 8, 8, 0, 16, 24, 16]
[ 3, 22, 1, 23] P1:[ 1, 17, 1, 17, 17]
[ 15, 12, 17, 13] P2: [ 26, 10, 10]
[ 10, 11, 5, 1] P3:[ 3, 11, 3, 11, 3]
[ 0, 21, 15, 16] P4: [ 20, 12]
[ 24, 14, 14, 16] P5:[ 13, 5, 21, 29]
[ 3, 17, 11, 17] P6: [ 22, 14, 14]
[ 7, 10, 29, 3] P7:[ 23, 15, 15, 7]
```

R M S using Grace Hash Join

R: P0

P0: [24, 8, 16]



R: P0 hash table

P0 Output: [(8,8),(8,8),(16,16), (24,24),(16,16)]

S: P0

P0:[8, 8, 0, 16, 24, 16]

Better Alternative?

- Hash Partitioning requires
 - * 1 page for input
 - * 1 page each for output buckets
 - considerably less than a large table
- * Hash Join (1 Pass) requires
 - * enough memory for the entire R relation
- * So likely to have memory available when we decide to do the Grace join approach

Hash Join: Hybrid Hash

- * If we ignore the memory requirements for hash partitioning, we can keep the first partition of R (Partition 0), in memory
- * Only have to write out and read the remaining partitions
- * Flexible: if we only need one partition, becomes like the ideal case where R fits in memory

Hash Joins Summary

- * Efficient but
 - Need a lot of memory to run well
 - * Can't really exploit the B+ tree indexes

(Sort)-Merge Join

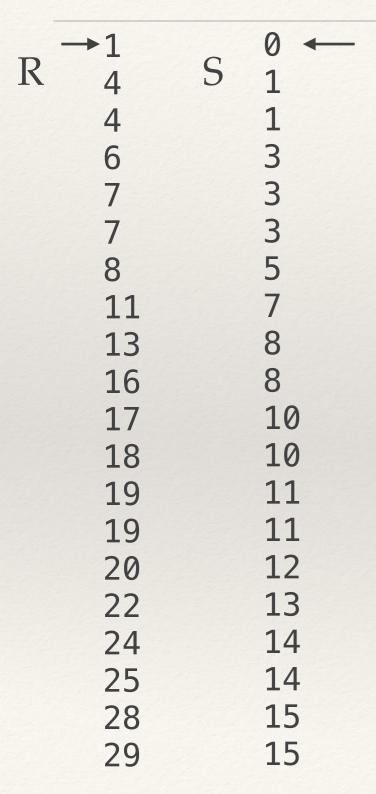
- Sort R and S on the join column(s)
 - * Hopefully, one or both are already sorted!
- * Scan R and S finding the matches, output matching rows
- * Sort costs are O(|R|log|R|), usually 4 I/Os (2 pass)
 - Followed by Reading of the sorted R and S (join-merge)
 - * Can combine the merge phase of the sort-pass with the "join-merge" phase
- Memory Efficient (compared to Hash Joins)
- * One or both relations can be already be sorted because of the nature of PK/FK relationships and how PI is generally chosen

```
R
```

```
[ 28, 7, 1, 13]
[ 7, 25, 24, 17]
[ 19, 6, 22, 4]
[ 8, 4, 20, 16]
[ 18, 19, 11, 29]
```

S

```
[ 0, 1, 1, 3]
[ 3, 3, 5, 7]
[ 8, 8, 10, 10]
[ 11, 11, 12, 13]
[ 14, 14, 15, 15]
[ 16, 16, 17, 17]
[ 17, 20, 21, 22]
[ 23, 24, 26, 29]
```



- * No match
- * Increment the smaller of two

```
S
R
                  13335
      6
      8
                  8
      13
      16
                  10
      17
                  10
      18
                  11
      19
                  11
      19
                  12
      20
                  13
      22
                  14
      24
                  14
      25
                  15
      28
                  15
      29
```

- * match, output (1,1)
- * Increment S

Output: (1,1)

```
S
R
      67
                  3 3 3 5
      8
                  8
      13
       16
                   10
       17
                   10
       18
                   11
       19
                   11
       19
                   12
      20
                   13
      22
                   14
      24
      25
                   14
                   15
      28
                   15
      29
```

- * match, output (1,1)
- * Increment S

Output: (1,1) (1,1)

```
S
R
      6
                  3 3 5
      8
                  8
      13
      16
                  10
      17
                  10
      18
                  11
      19
                  11
      19
                  12
      20
                  13
      22
                  14
      24
      25
                  14
                  15
      28
                  15
      29
```

- * no match
- * Increment smaller of two

```
Output: (1,1) (1,1)
```

```
S
R
                 1
                 3
      8
                 8
      16
                 10
                 10
      18
      19
                 11
      19
                 12
      20
                 13
      22
                 14
      24
      25
                 14
                 15
      28
                 15
      29
```

- * no match
- Increment smaller of two
- * Have to consider tied values in R as a group

```
Output: (1,1) (1,1)
```

```
S
R
                  1333
      8
      13
      16
                  10
                  10
      18
      19
                  11
      19
                  12
      20
                  13
      22
                  14
      24
      25
                  14
                  15
      28
                  15
      29
```

- * no match
- * Increment smaller of two
 - optimize to next higher value

```
Output: (1,1) (1,1)
```

```
R
                  1333
      8
      16
                  10
                  10
      18
      19
                  11
      19
                  12
      20
                  13
      22
                  14
      24
      25
                  14
                  15
      28
                  15
      29
```

- * no match
- Increment smaller of two
 - tied values are treated as a group in R

```
Output: (1,1) (1,1)
```

```
S
R
                  1
3
3
3
      8
                  8
      13
       16
                  10
       17
                  10
       18
                  11
       19
                  11
       19
                  12
      20
                  13
      22
                  14
      24
      25
                  14
                  15
      28
                  15
      29
```

- * no match
- * Increment smaller of two

```
Output: (1,1) (1,1)
```

```
S
R
                  13335
                  8
      13
      16
                  10
      17
                  10
      18
                  11
      19
                  11
      19
                  12
      20
                  13
      22
                  14
      24
      25
                  14
                  15
      28
                  15
      29
```

- * match, output (7,7), (7,7)
- have to iterate through all tied values in R
- * increment S

```
Output:
(1,1)
(1,1)
(7,7)
(7,7)
```

```
S
R
                  1333
      16
                  10
      17
      18
                  10
                  11
      19
                  11
      19
                  12
      20
                  13
      22
                  14
      24
      25
                  14
                 15
      28
                  15
      29
```

- * mismatch
- * increment smaller value

```
Output:
(1,1)
(1,1)
(7,7)
(7,7)
```

```
S
R
                  1333
      6
      11
      13
                  8
      16
                  10
      17
      18
                  10
                  11
      19
                  11
      19
                  12
      20
                  13
      22
                  14
      24
      25
                  14
                  15
      28
                  15
      29
```

- * match output (8,8)
- * increment S

```
Output:
(1,1)
(1,1)
(7,7)
(7,7)
(8,8)
```

```
S
R
                  1333
      6
                  8
      13
      16
                  10
      17
      18
                  10
                  11
      19
                  11
      19
                  12
      20
                  13
      22
                  14
      24
      25
                  14
                  15
      28
                  15
      29
```

- * match, output (8,8)
- * increment S

```
Output:
(1,1)
(1,1)
(7,7)
(7,7)
(8,8)
(8,8)
```

```
S
R
                  1333
      6
                  8
      13
      16
                  10 ←
      17
                  10
      18
                  11
      19
                  11
      19
                  12
      20
                  13
      22
                  14
      24
      25
                  14
                  15
      28
                  15
      29
```

- * mismatch
- * increment smaller of two

```
Output:
(1,1)
(1,1)
(7,7)
(7,7)
(8,8)
(8,8)
```

```
S
R
                 1333
      6
   →11
                 8
      13
      16
                 10 ←
      17
                 10
      18
                 11
      19
                 11
      19
                 12
      20
                 13
      22
                 14
      24
      25
                 14
                 15
      28
                 15
      29
```

- * mismatch
- * increment smaller of two

```
Output:
(1,1)
(1,1)
(7,7)
(7,7)
(8,8)
(8,8)
```

Sort-Merge Join

- Some special handling required to handle ties
- Otherwise a simple scan over the two sorted inputs
- * Think "Block nested loop" being performed on tied values
 - * Multiple scans of the tied rows of S may be required in really bad cases if the tied R rows don't fit in memory