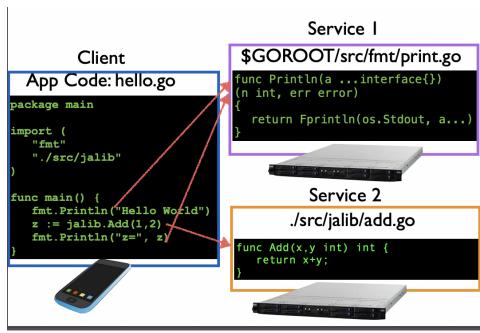
# MapReduce

- 1. Example
  - a. File with #pid, age, diag, glucose level, heart rate, ...

135, 36, d1, 120, ..., ....

- b. Problem: Average glucose level for all patient between 40 and 60 years old and group by diagnosis code in terms of MapReduce
  - i. Map phase
    - 1. input: partition of file
    - 2. Output (require intermediate key value pair)
      - a. Key: diag
      - b. value: glucose level
    - 3. The filtering of age (age between 40 and 60) within the map phase
  - ii. Data Shuffle (between map and reduce phase)
    - 1. The distribution of key-value pair inside map to appropriate reduce function
  - iii. Reduce phase
    - 1. Reduce (key, iterator)  $\rightarrow$  reduce (diag, [glucose 1, glucose 2, ...]
    - 2. Diag  $\rightarrow$  iterator
    - 3. Sum the glucose level per diagnosis
    - 4. Record the count for each key
    - 5. Divide Sum by the count to calculate the average
    - 6. Output  $\rightarrow$  (diagnosis, average)  $\rightarrow$  [(d1, avg), (d2, avg), ...]
- c. What happens if there exists a skew in data (d1 has huge amounts of data while other diagnoses do not contain many data)?
  - i. Ex) (d1, g1), (d1, g2), (d2, g3), (d3, g4),  $(d1, g5) \rightarrow many diagnosis for d1$
  - ii. Combiner function between map phase and reduce phase that adds all the glucose values (g) for each key diagnosis (d)→ reduce intermediate amount of data
    - 1. d1, (322, 3)
    - 2. d2, (g3, 1)
    - 3. d3, (g4, 1)
- 2. RPC Remote Procedure Calls
  - a. One of the bread and butter building blocks for distributed system construction
  - b. Hopefully a particular RPC infrastructure is boring once you get the basic idea and have read the docs
  - c. Our goal today is to both get a handle on the idea and use

#### 3. The idea: libs as services



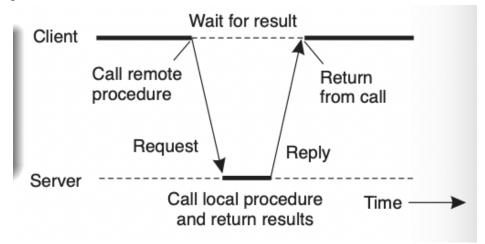
- b. Functions as services:
  - i. Functions do not have to be stored in the same machine
  - ii. Different applications/users can use the same function
- 4. Remote Procedure Call (RPC)
  - a. Observations:

a.

- i. Application developers are familiar with simple procedure model
- ii. Well-engineered procedures operate in isolation (black box)
- iii. There is no fundamental reason not to execute procedures on separate machine

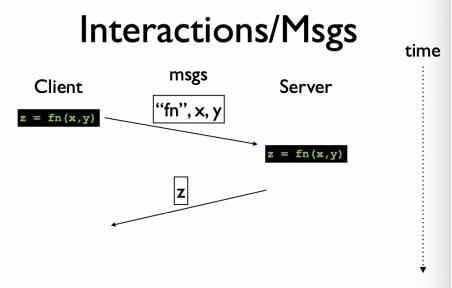
#### b. Conclusion

i. Communication between caller & callee can be hidden by using procedure-call mechanism

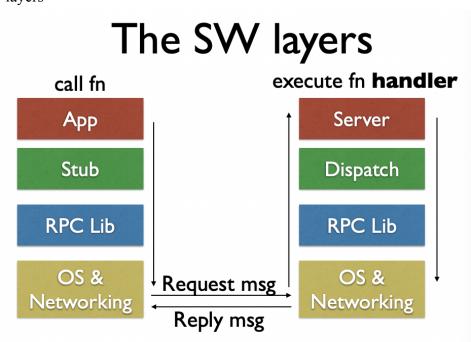


ii.

# 5. Interactions/Msgs

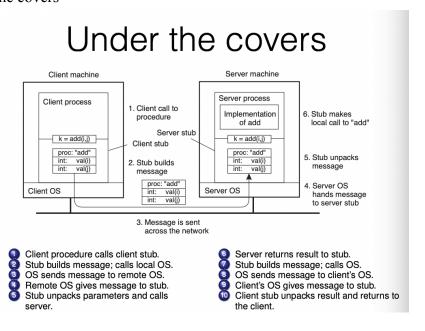


a.6. The SW layers



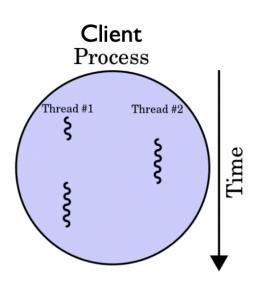
- a.
- b. Program initiates actual RPC
- c. The application using RPC communicates and request the RPC
- d. How to do this: take an object  $\rightarrow$  break into bytes  $\rightarrow$  send to RPC library  $\rightarrow$  send to operating system  $\rightarrow$  send it to other server and repeat the process (reconstruct the object  $\rightarrow \dots \rightarrow$  send to application on the server side)

## 7. Under the covers

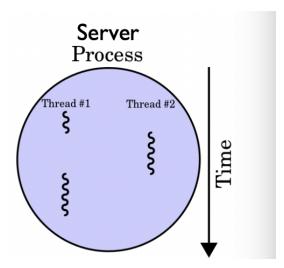


## 8. Threads

a.



b. Might have multiple threads all of which could concurrently be making rpc's to one more servers



d. Rpc handlers might take a long time - often use threads to execute many rpcs concurrently (thread per handler execution)

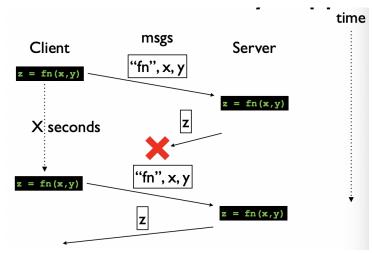
## 9. Failures?

c.

- a. Lost packet
- b. Broken network
- c. Slow server
- d. Crashed server
- e. From the client's perspective, failures typically mean that client is waiting for a reply that will never come

# 10. If (no reply in X seconds) then?

a. At least once failure model



ii. Regardless of failures execute the rpc at least once

iii. While true {

}

i.

Send request Wait x seconds for reply If reply return

- iv. As long as eventually some or something fixes the problem (eg. robot server, fix network), then this will always work
- v. It does work for read-only operations
- vi. Or you have a strategy for duplicates (which later labs will require)

#### b. At most once

- i. Server detects duplicates and not execute handler
- ii. Easy way to detect duplicates
  - 1. RPC id

```
Client

z = fn(x,y)

if seen[xid]

return old[xid]

else

r = handler(fn,x,y)

old[xid] = r

seen[xid] = true

return r
```

a.

```
if seen[xid]
  return old[xid]
else
    r = handler(fn,x,y)
    old[xid] = r
    seen[xid] = true
    return r
fi
```

- b.
- c. Introduce a unique id per-RPC invocation and some storage

  → if time runs out, and tries again, it uses the same id as
  the old id
- d. Server side: Server has to maintain all these ids (which can lead to running out of memory)
- e. This works but there are some issues
- f. How do we delete things from old and seen?
  - i. Get an ack from the client for XID for which it has received responses