

## Motivation

- Air leaks waste between 25% and 40% of the total energy in industry [1]
- Current methods of detecting air leaks are inefficient [2]
- Our approach can passively detect where leaks are without intrusive methods

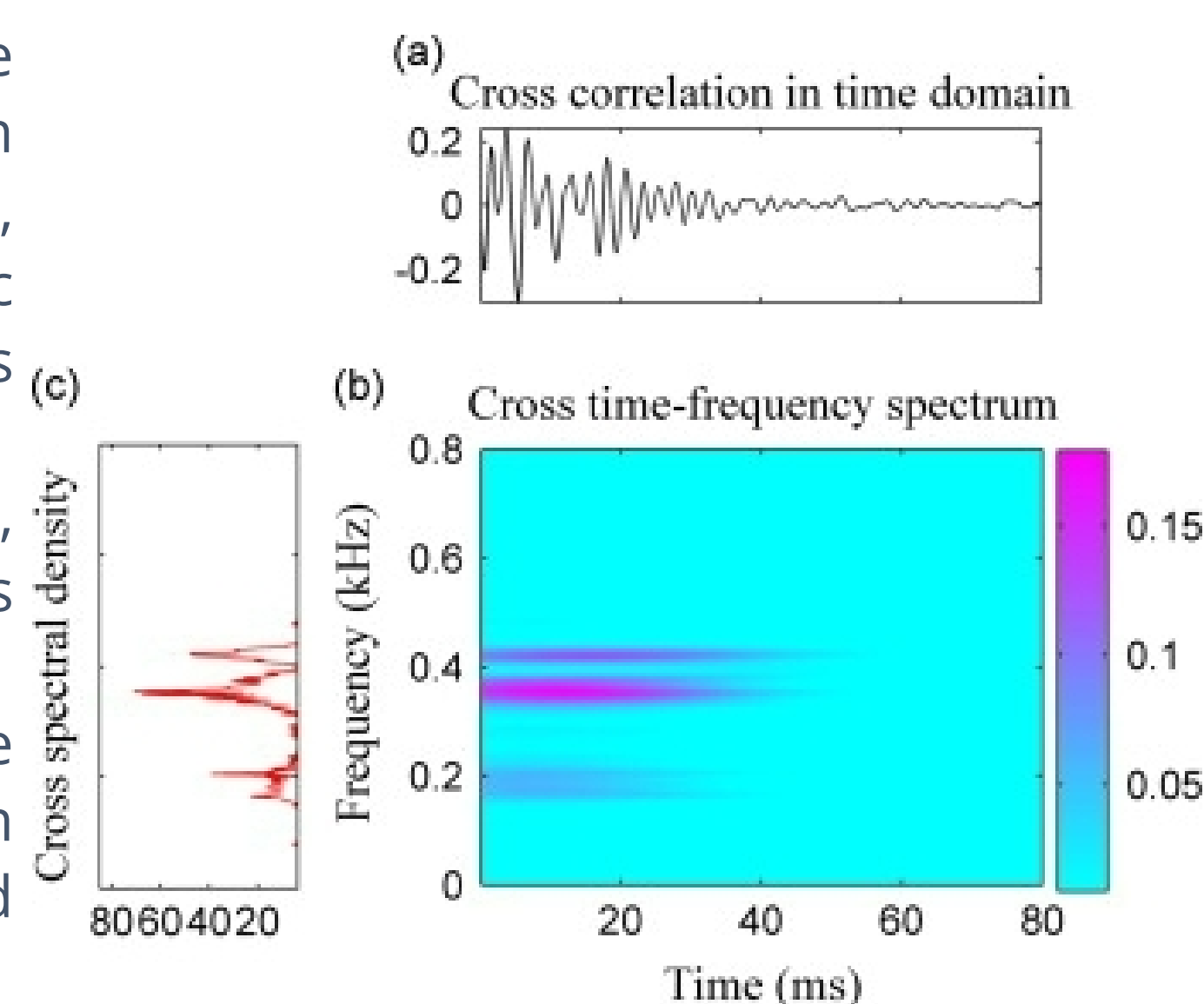


## Objective

Develop a practical system that records the vibrations in a pipe with an accelerometer and wirelessly transmits the data to a centralized system. The centralized system will combine the data from two or more sensors using frequency and time-based analysis methods to detect the location of air leaks along the pipe that the multiple sensors are connected to.

## Cross-Time Frequency Spectrum (CTFS)

- CTFS is used for analyzing the characteristics of acoustic signal in both time and frequency domains, primarily applied to analyze acoustic vibrations caused by pipeline leakages [3]
- Acoustic signals vary over time, allowing detection of spatial changes along the pipelines
- Using CTFS, we determine the time distance of arrival (TDOA) which can give us the distance from the induced leak to our sensors



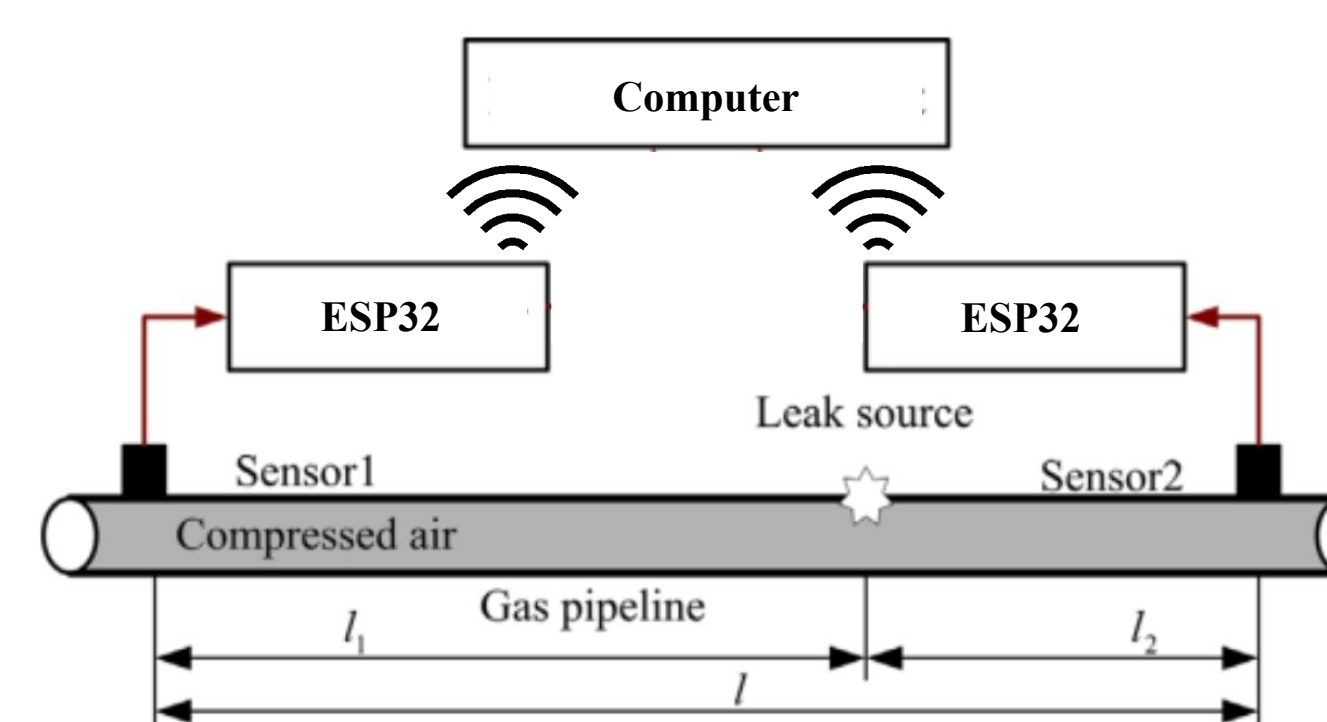
## Requirements

Criteria	Goal
Deviations from the linear response	no less than 0.5%
Noise Level of Accelerometer	< 20 $\mu g$ / $\sqrt{Hz}$
Cross-axis sensitivity	below 2%
System Accuracy	95%

- Design an applicable demo showcasing the functionality of the air leakage detection system
- Demo includes a simulation or real-world scenario illustrating detection, wireless communication, and prompt warning signal transmission.

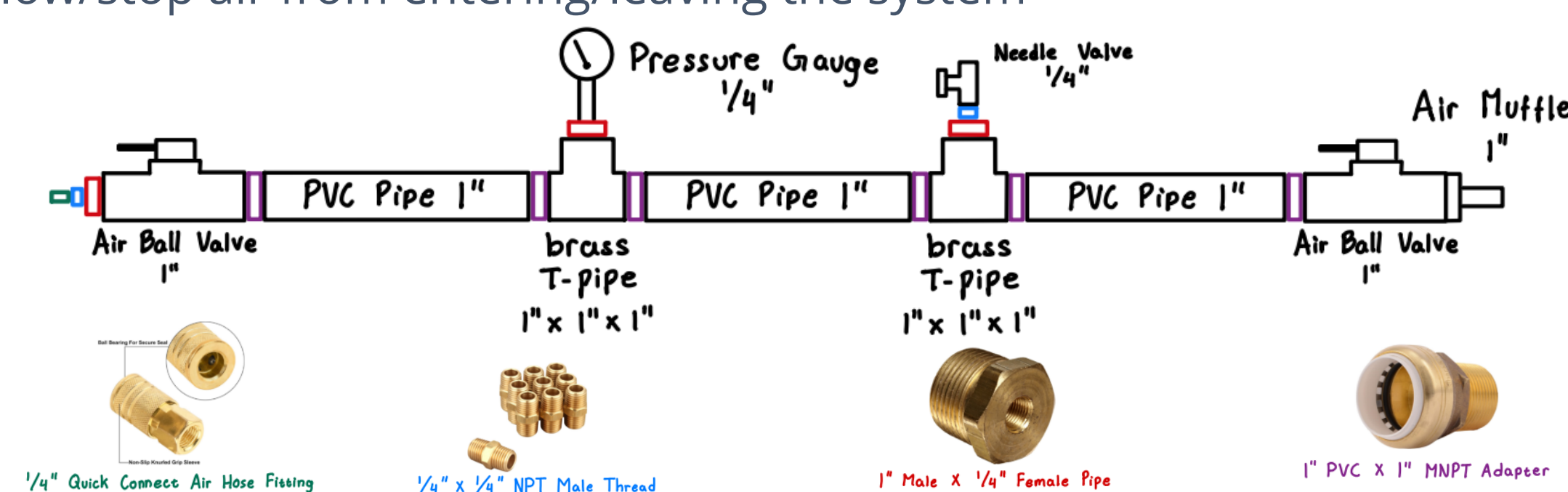
## Technical Design of System

- System has two LIS3DHH accelerometer placed on either side of an induced leak made up of compressed air
- The sensors send data to ESP32s then wirelessly sends that data to computer running a server



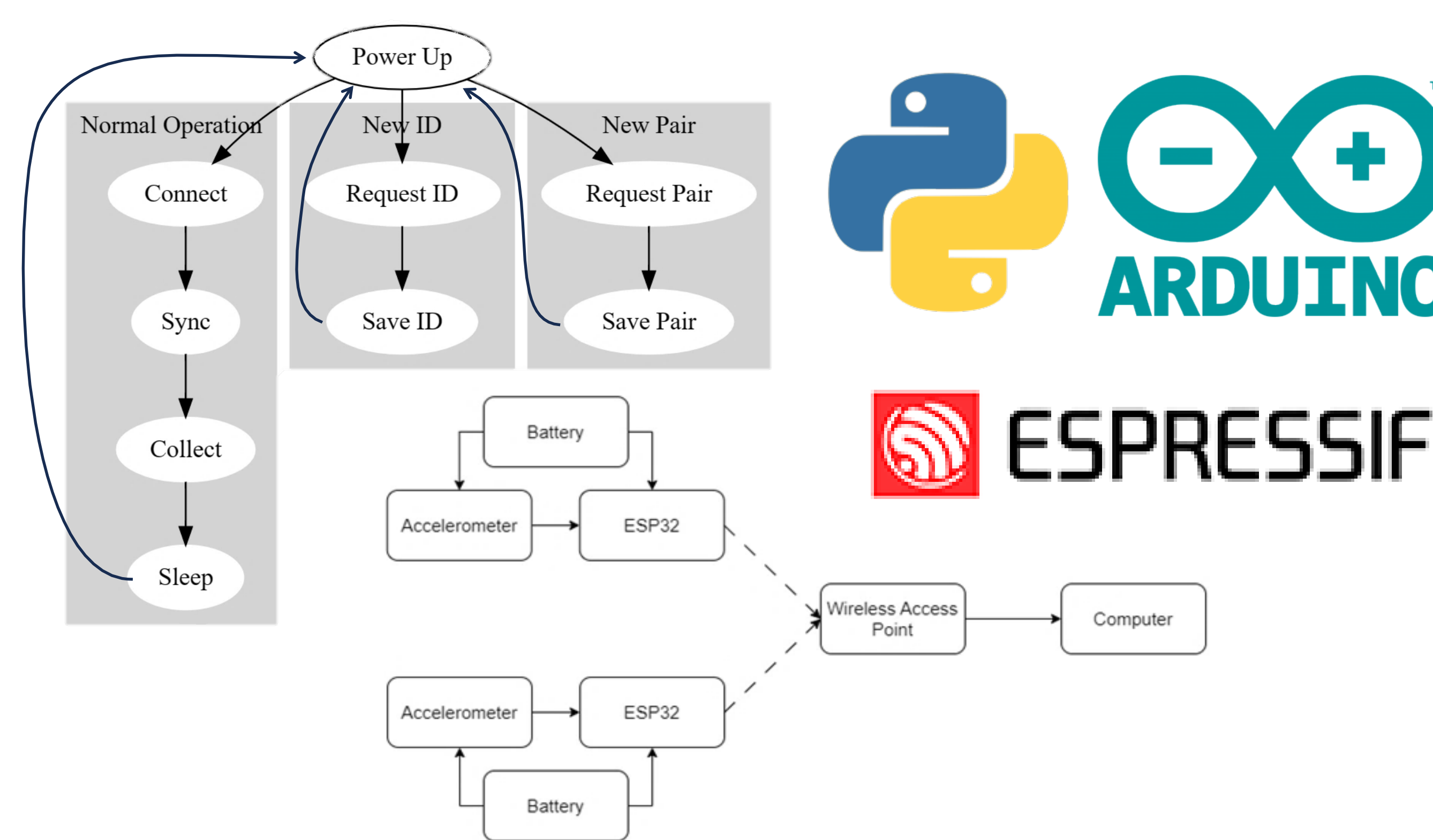
## Technical Design of Pipe

- Leak is induced by opening the needle valve and pressure within the system is measured by the pressure gauge
- Air compressor connects to the left side of the pipe and the air ball valves allow/stop air from entering/leaving the system



## Hardware/Software Design

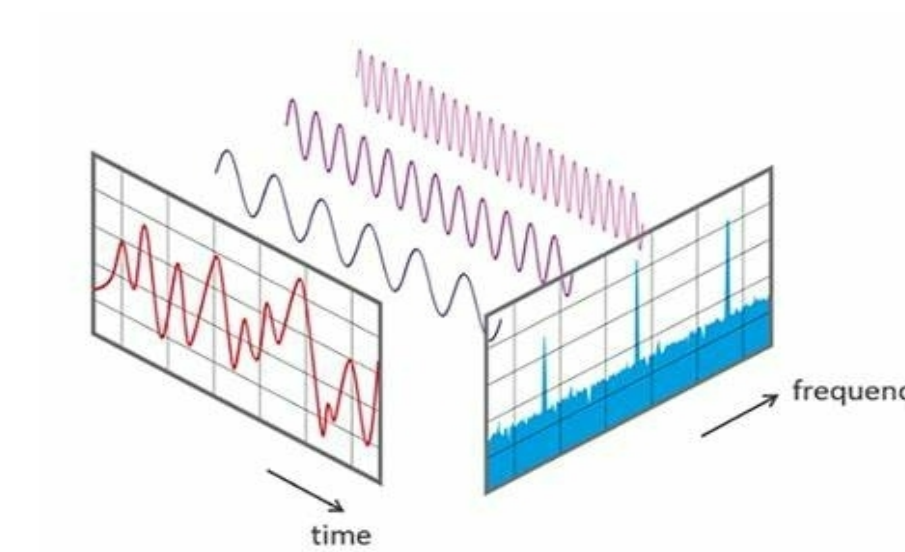
- ESP32 microcontroller collects data from accelerometer and relays data using TCP through wireless access point to computer
- Computer collects data from multiple sensor systems and performs processing on data to locate possible leaks
- Simplified state machine for the sensor on the top left
- Bottom image shows a high-level diagram of the system



## Detecting Leak Method

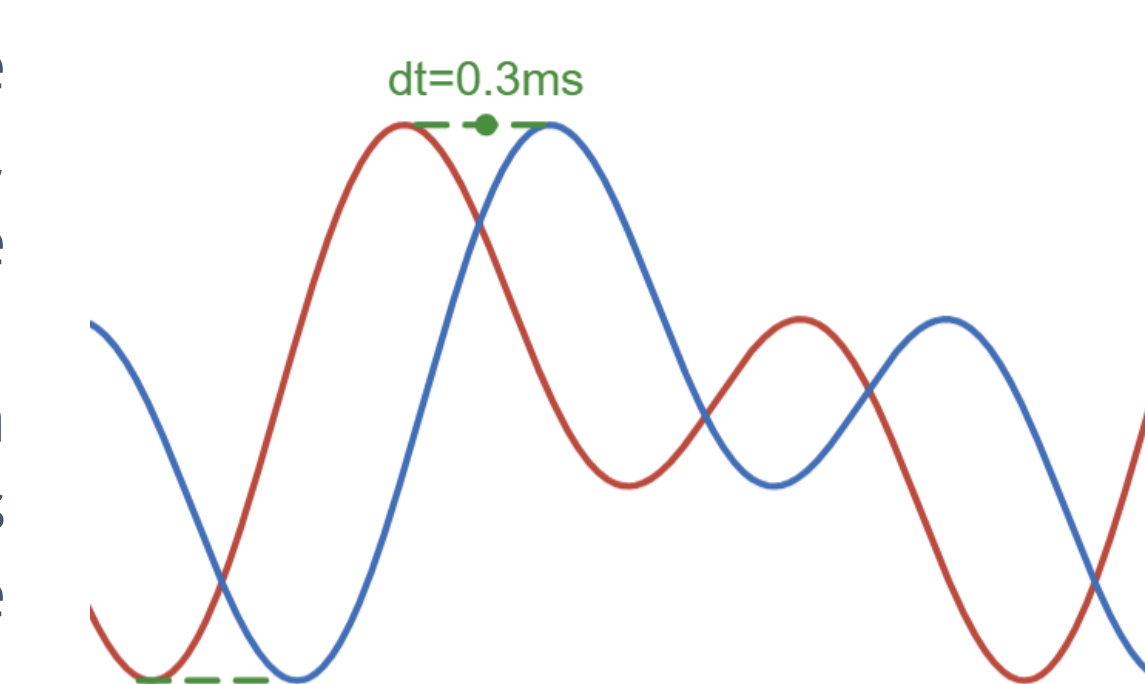
### Leak Detection

- Identified energy imbalance between leak and no leak in low frequency range, used this to differentiate when a leak is present
- LSTM Machine learning model also used as an alternative for leak detection



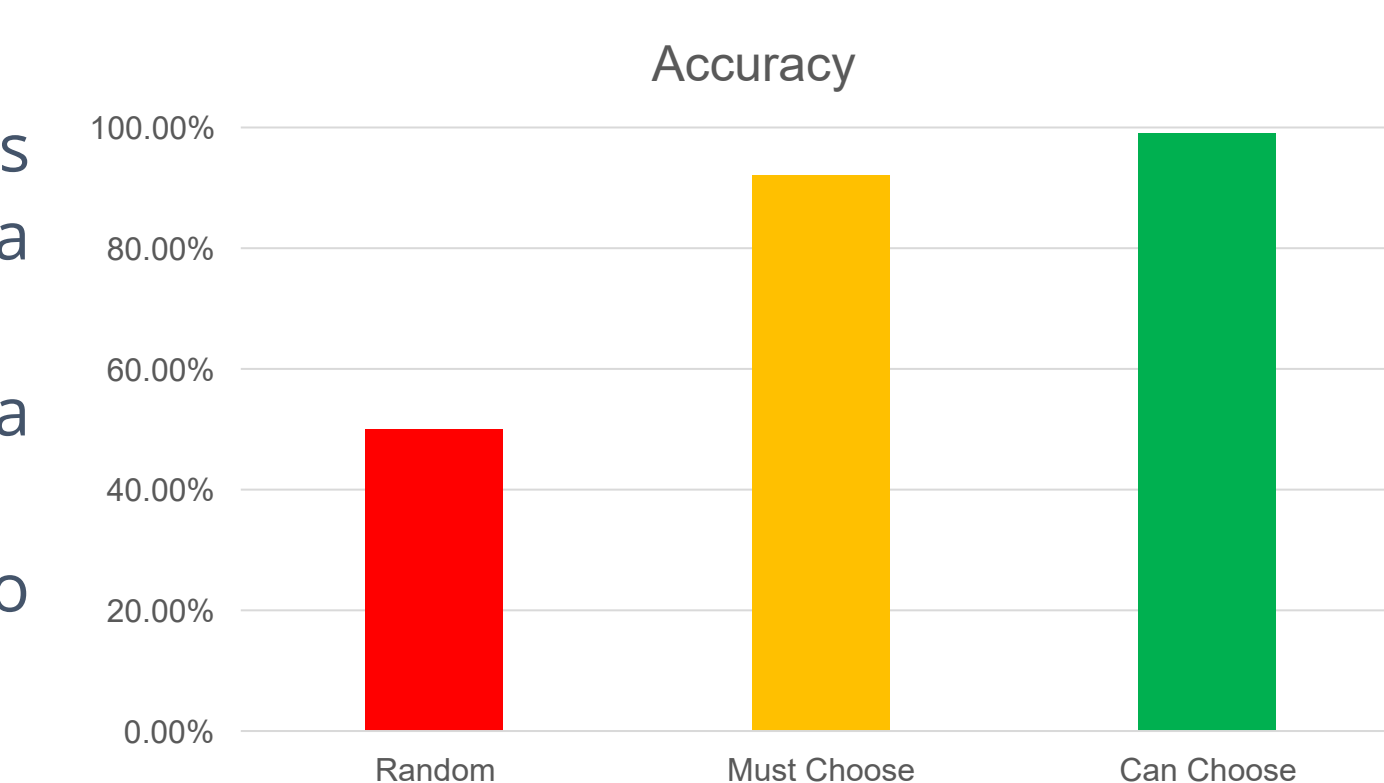
### Leak Localization

- Used correlation to find the time difference between sensor readings, which is used to calculate distance using speed of sound
- Cross time frequency spectrum analysis gives a more accurate guess given the propagation profile of the pipe



## Results

- If the system only classifies confident predictions, it has a 99.07% accuracy
- If system must always make a choice, it has 91.28% accuracy
- System can determine the leak to within 20cm of its actual location



## Conclusion

- Detecting air leaks using CTFS is an effective and viable method
- Through our tests and data, we found our approach to be highly accurate and precise
- Once the project is expanded upon, it can be applied directly to industrial piping systems to minimize wasted energy

## Future Work and References

- Make system self-sustaining for months at a time
- Test a variety of different types of leaks
- Design and manufacture PCBs for large scale production
- Implement Low Power mode to save battery life
- Implement display that shows when/where leak is

[1] "Are You Wasting Money Fixing Compressed Air Leaks?" Efficient Plant. Retrieved from <https://www.efficientplantmag.com/2011/09/are-you-wasting-money-fixing-compressed-air-leaks/>

[2] A. Lewis, S. Yuen, and A. Smith, Detection of gas leakage from landfills using infrared thermography - applicability and limitations, <https://journals.sagepub.com/doi/abs/10.1177/0734242X0302100506> (accessed May 13, 2024).

[3] "Leak location in gas pipelines using cross-time-frequency spectrum of leakage-induced acoustic vibrations" ScienceDirect. Retrieved from <https://www.sciencedirect.com/science/article/abs/pii/S0022460X14002831>