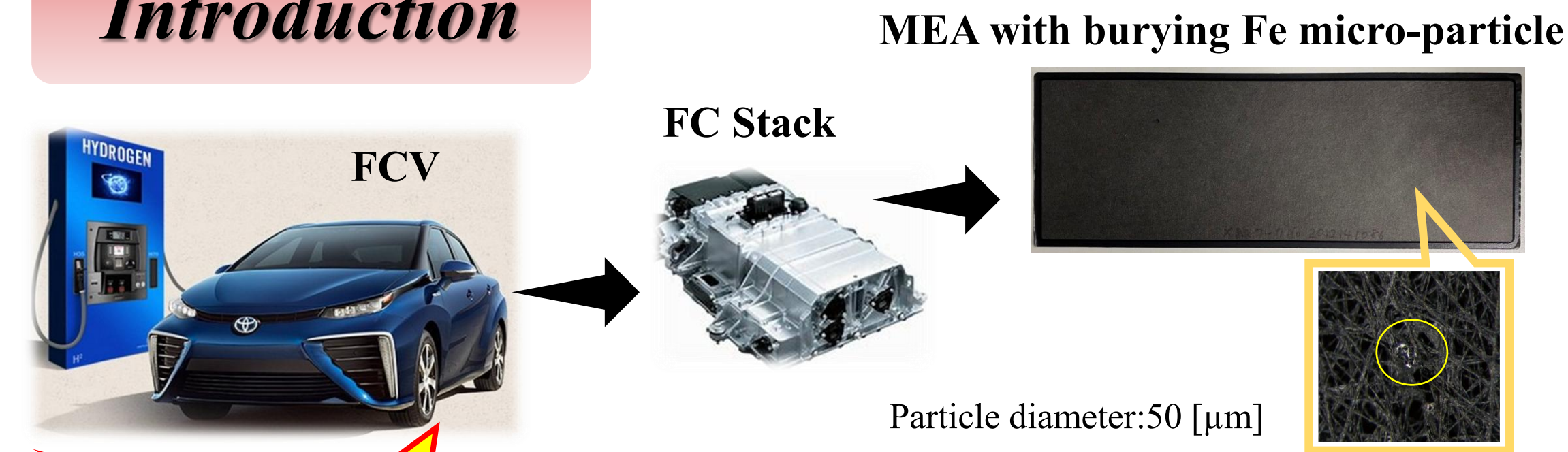


Introduction

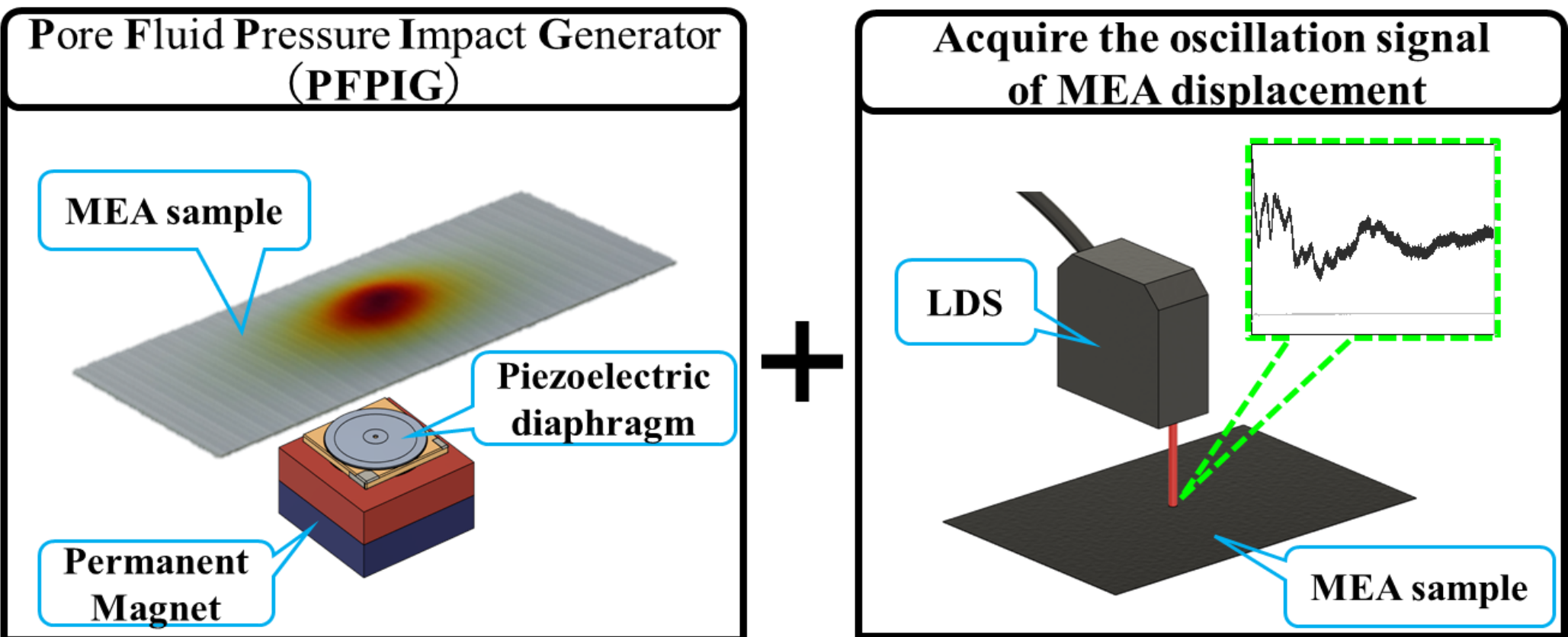


In recent years, fuel cells have been expected to be a promising technology for achieving “Carbon Neutrality”. In the manufacturing process of MEA, the main component of fuel cell, there remains the problem of metallic foreign micro-particles contaminating MEA, reducing not only the power generation efficiency but also safely utilizing hydrogen. X-ray inspection is commonly used as a method for detecting metallic particles, which has serious industrial problems such as high cost and long inspection time. Therefore, there is a need for a simple system that can automatically detect the presence or absence of metallic foreign matter in real time.

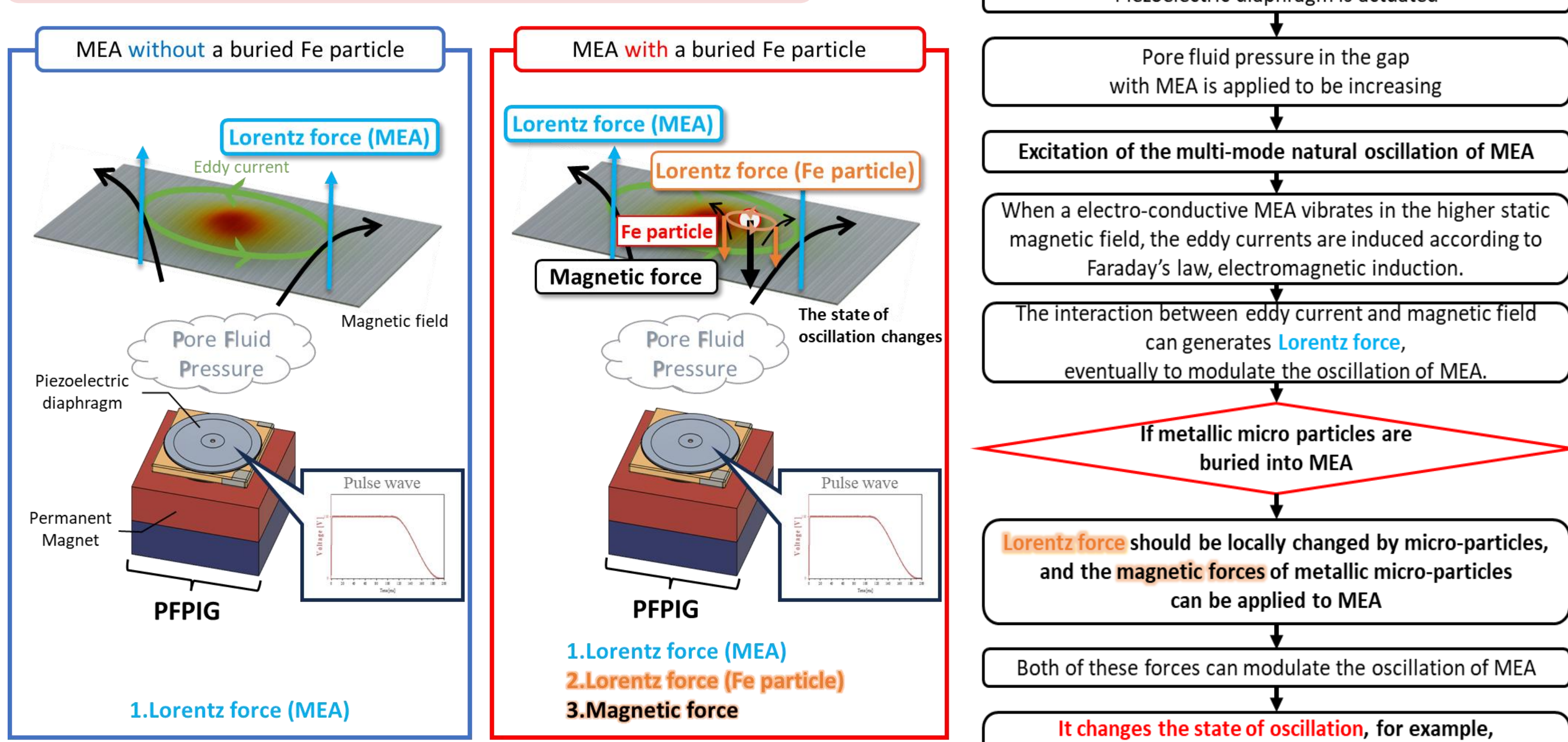
Objectives

A rapid and automatic diagnosing system of metallic micro-particles, namely PFFA-LDS (Pore Fluid Pressure Assisted - Laser Displacement Sensor) under static magnetic field is proposed and constructed. PFFA-LDS is based on a vibration testing technique for contaminants Inspection, which is attributed to both eddy current Lorentz force and magnetic force.

- non-contact
- cost
- inspection time
- detectable particle size

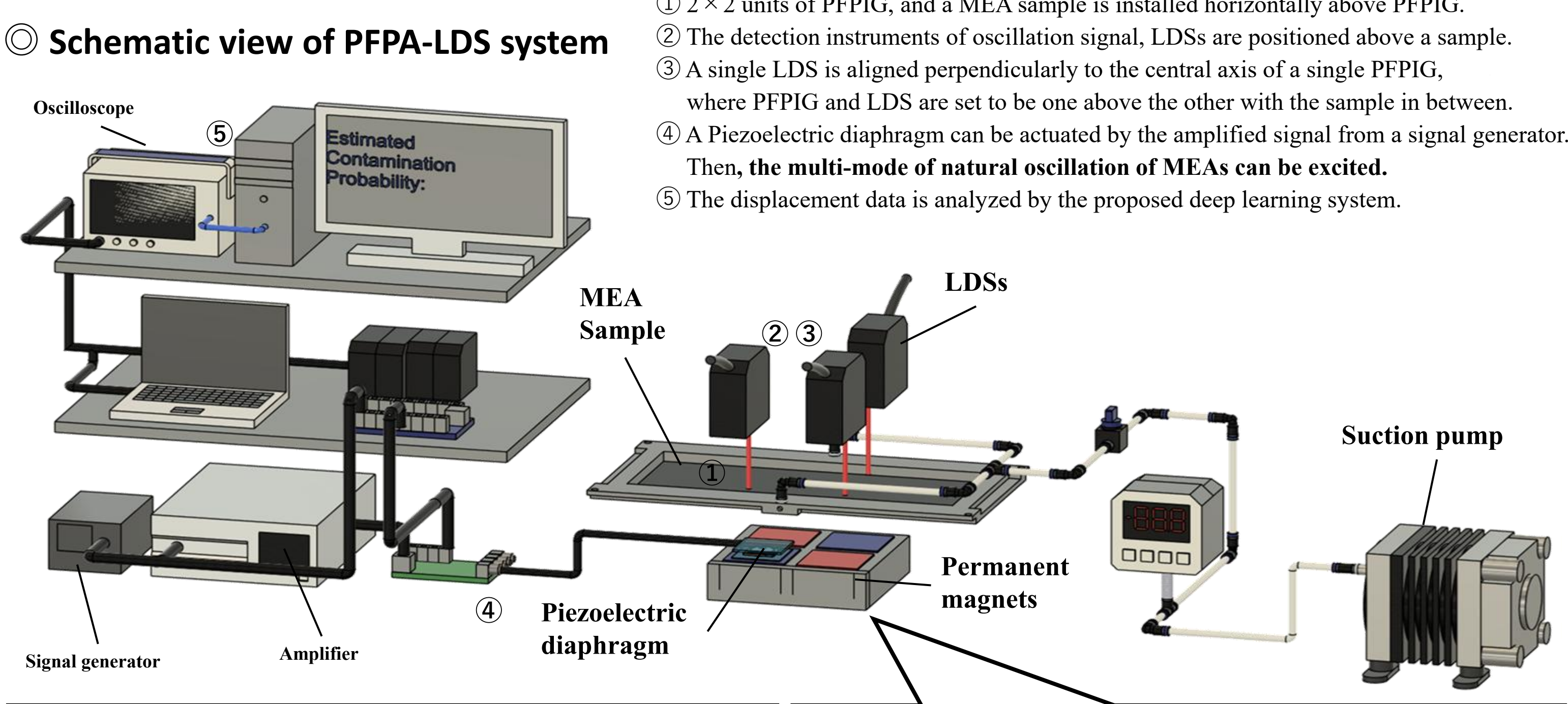


Proposed Method PFFA-LDS



Pore Fluid Pressure Impact Generator, PFFIG, is constructed by a Piezoelectric diaphragm actuator placed on a permanent magnet, where is installed just below a MEA sample, then it can excite the natural oscillation by the pulsed actuation. When an electro-conductive MEA vibrates in the static magnetic field, the eddy currents are induced according to Faraday's law, electromagnetic induction. The interaction between eddy current and magnetic field can generates Lorentz force. When metallic micro-particles are buried into MEA, Lorentz force should be locally changed by micro-particles. Eventually, both of Lorentz forces and magnetic forces, including pore fluid pressure, can modulate the oscillation of MEA. The presence or absence of metallic foreign micro-particles can change the state of oscillation, for example, amplitude, frequency, phase, damping ratio, *e.t.c.*, which is dependent on each mode of natural oscillation.

Experiment



**Boundary Conditions**

All sides of sample boundaries are installed on the suction groove machined on a sample holder, where it was fixed by negative pressure 78 [kPa] by a vacuum pump.

Condition	Param
Suction groove width	1 [mm]
Negative pressure	-78 [kPa]
Intake volume	74 [L/min]

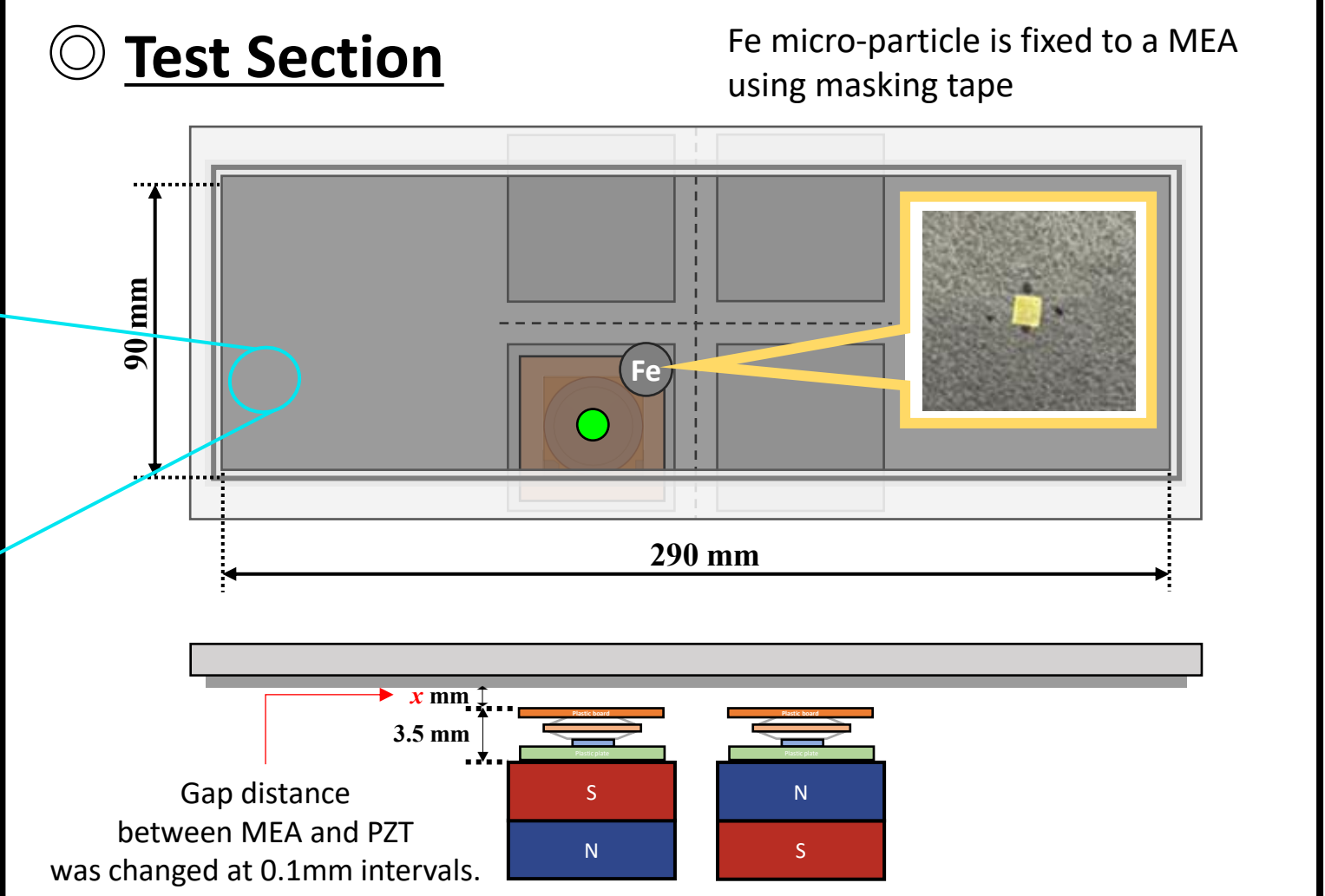
**MEA sample Conditions**

- MEA samples were prepared in rectangular sizes of 300 [mm] and 100 [mm].
- The particle diameter is about 150 [μm] and is placed on the inspection area of the PFFIG unit.
- 16 sheets of MEAs were applied with the presence or absence of Fe micro-particles.
- The MEA sample was reinstalled three times.

**Measurement Conditions**

The oscillation signal of displacement was detected by LDS directly above the PFFIG unit and then was acquired as 50 thousand points of time series data by oscilloscope.

Condition	Param
Measurement unit	Bottom Left Center
Sampling rate	100000 [Hz]



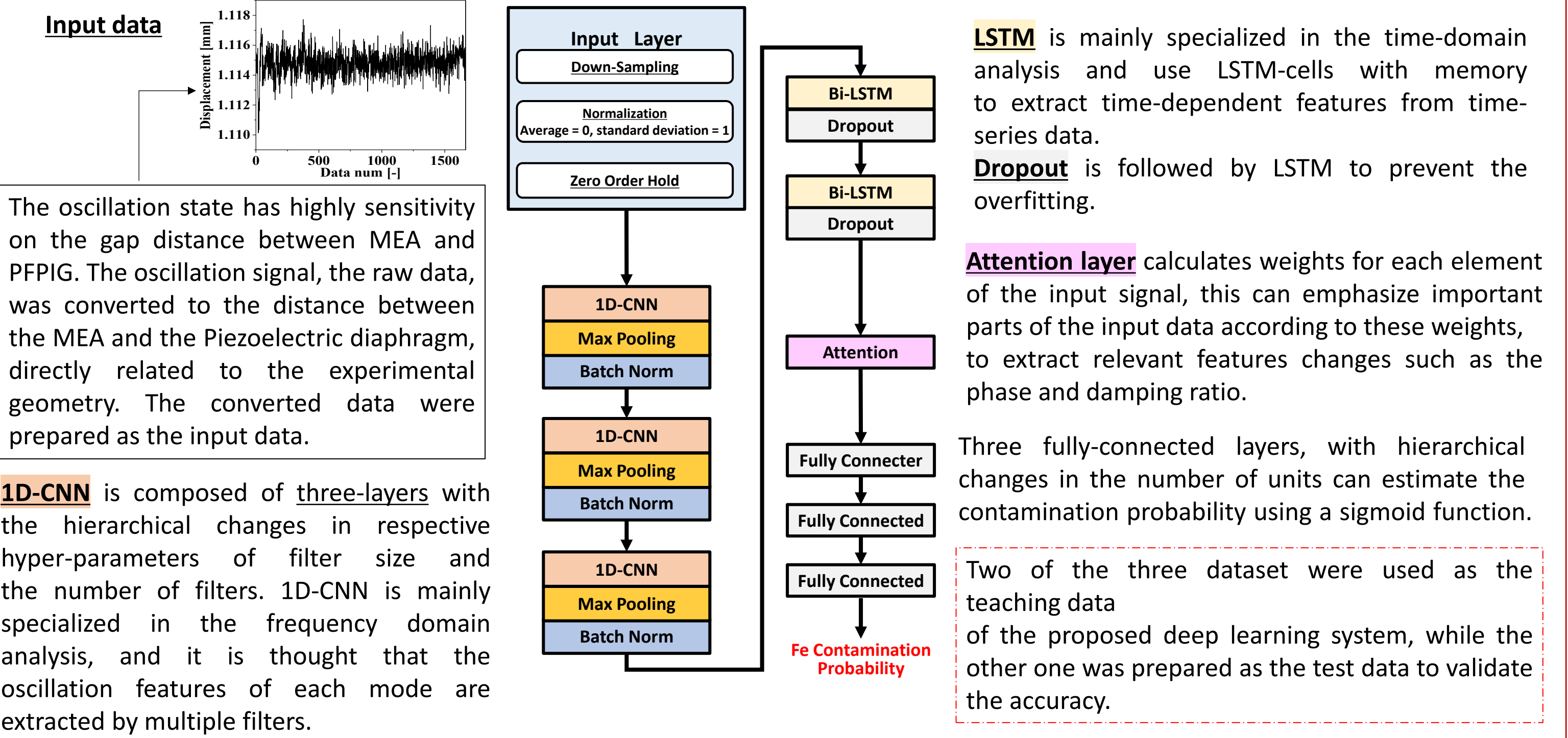
**Piezoelectric diaphragm driving Conditions**

- The piezoelectric diaphragm is moved upward to a sample and then kept position there.
- The piezoelectric diaphragm is repeatedly driven 20 times at 500 [ms] intervals.
- This movement can generate a pulse-like pore fluid pressure to excite the multi-mode of natural oscillation of MEA sample.

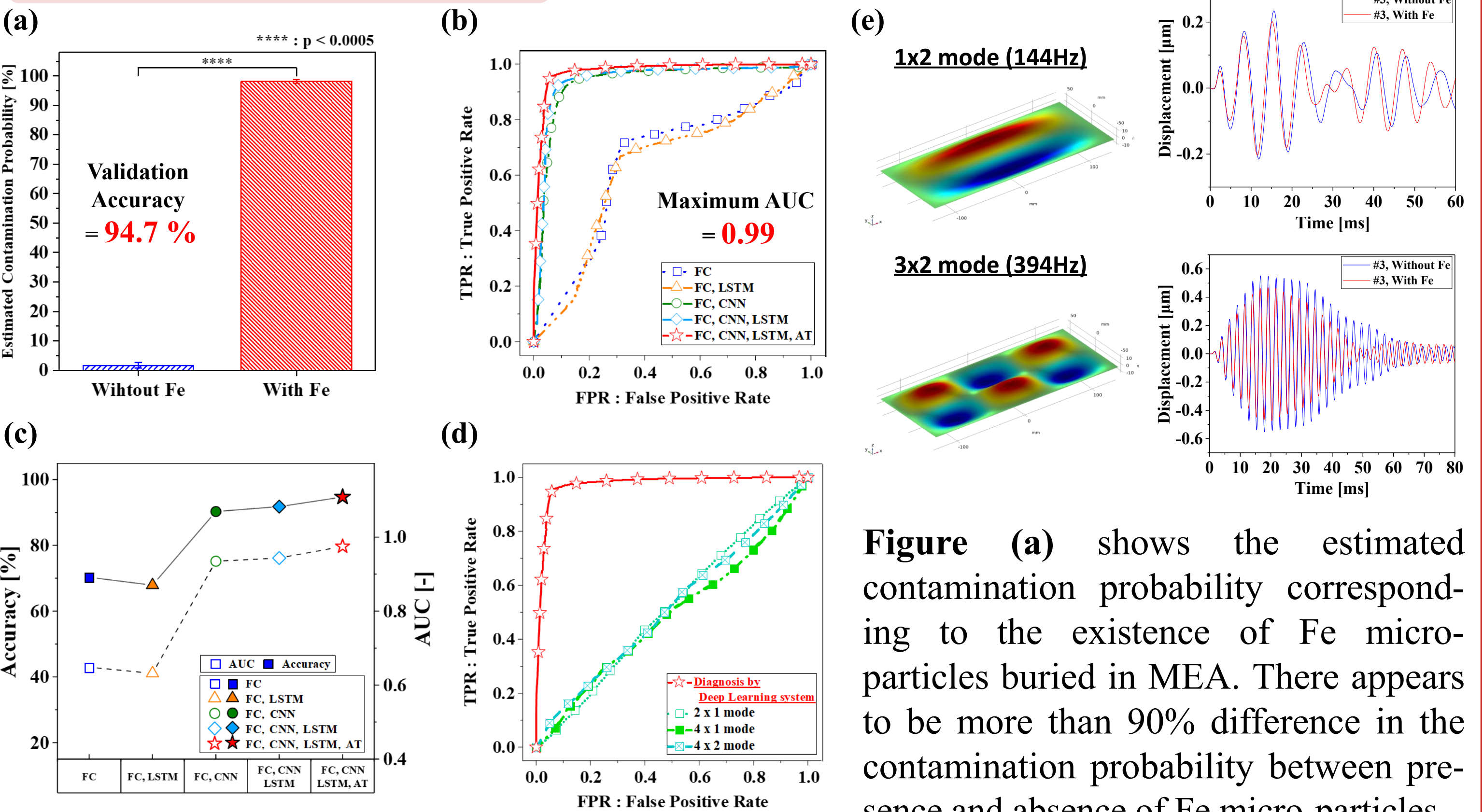
Condition	Param
Signal type	Step
Voltage	110 [V]
Time width	110 [ms]

Deep Learning Model

This DL model consists mainly of 1D-CNN and Attention-LSTM, both of which networks are directly connected to extract the oscillation features from obtained signals of the excited multi-mode of natural oscillation.



Result & Discussion



and the standard deviation was suppressed under 1% with validation accuracy approaching to 95%. **Figure (b)** shows a result of ROC analysis, the red curve of **proposed PFFA-LDS** system can indicate the high accuracy with AUC=0.99, signifying excellent discriminatory power between positive and negative classes. Additionally, **Figure (c)** shows the dependency of accuracy and AUC on DL models. **1D-CNN** is found to be particularly effective in extracting frequency-dependent features for each oscillation mode. **Attention-LSTM** is found to have a high potential to extract accented time-dependent features such as the phase and damping of each oscillation mode signal. **Figure (d)** shows the comparison with the standard phase analysis of each modes as ROC curves, apparently resulting in the significant enhancement of classification. **Figure (e)** shows examples of time series oscillation data corresponding to two different natural oscillation modes excited by the pore fluid pressure. It can be seen that the amplitude, frequency, phase, and damping ratio are changed depending on the presence or absence of foreign objects. In addition, there seems to be a significant difference between 1x2 mode and 3x2 mode. Therefore, the oscillation state has different dependencies on each modes of natural oscillation.

Conclusions

We present the proposed system, PFFA-LDS, based on a vibration testing technique for contaminants inspection, which is attributed to both eddy current Lorentz force and magnetic force, additionally pore fluid pressure. The instrumented DL model, which is directly connected to 1D-CNN and Attention-LSTM, can extract the oscillation features to detect metallic micro-particles from the obtained signals of the excited multi-mode of natural oscillation. In conclusions, the proposed method has an effective potential as an automatic diagnostic system of metallic micro-particles buried into MEA.