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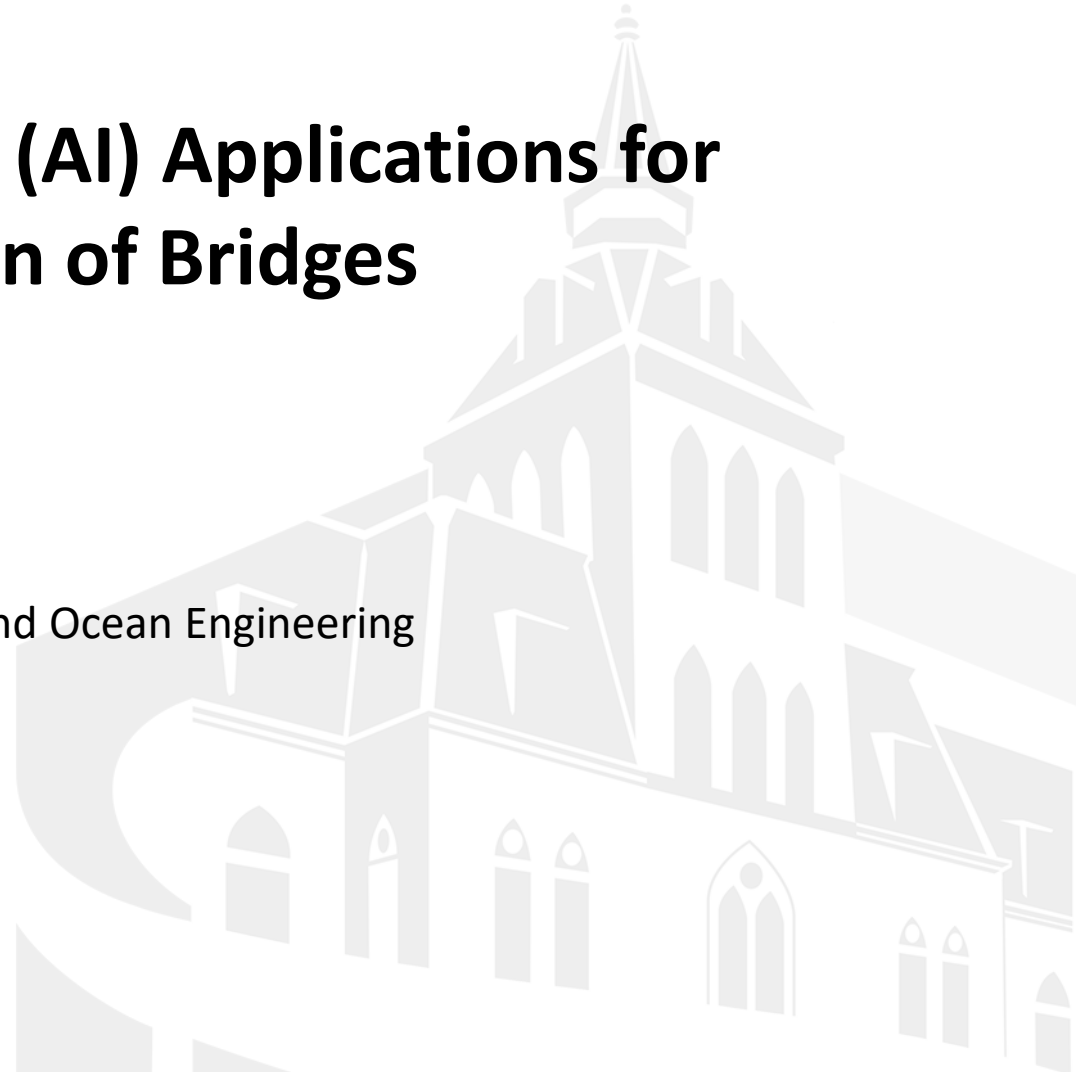
# Artificial Intelligence (AI) Applications for Design and Inspection of Bridges

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- **Previous research**
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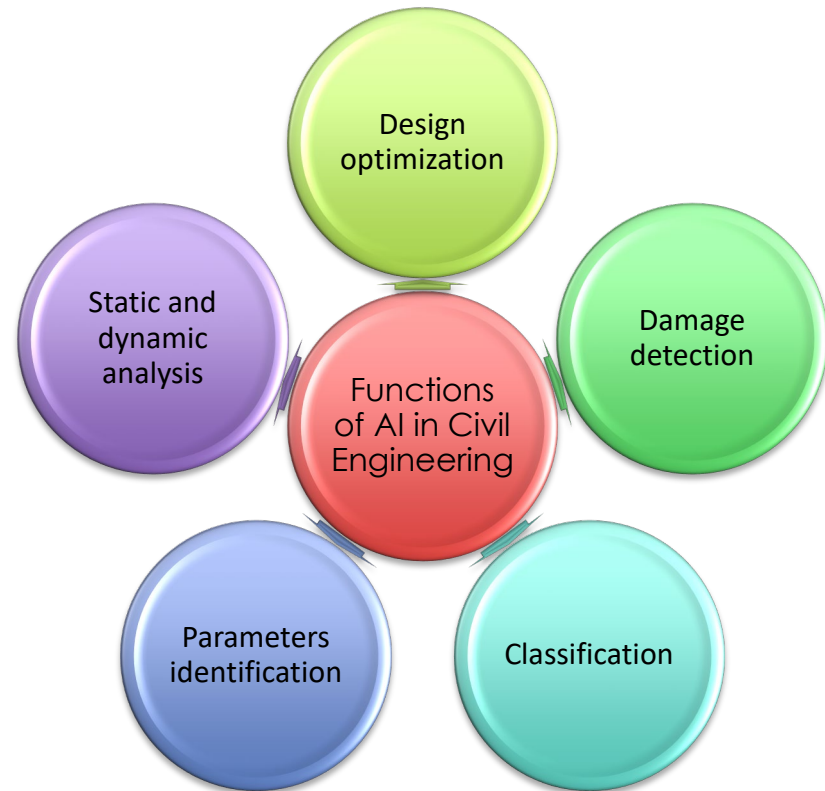
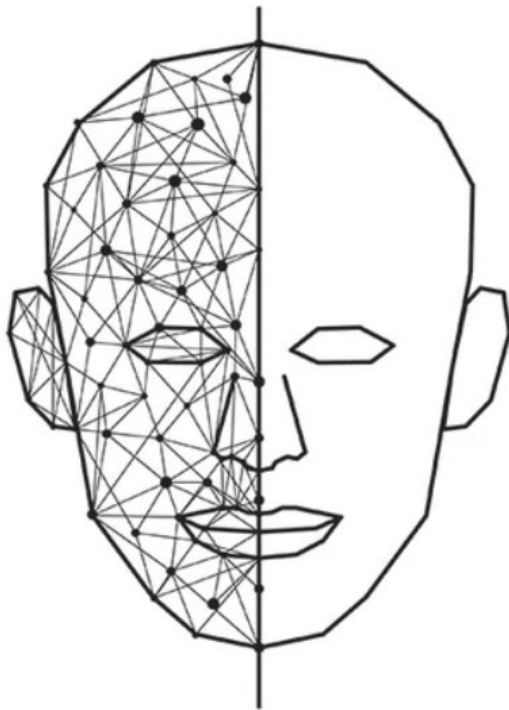


# Introduction

- **Artificial Intelligence**
- **Optimization**
- **Machine Learning**

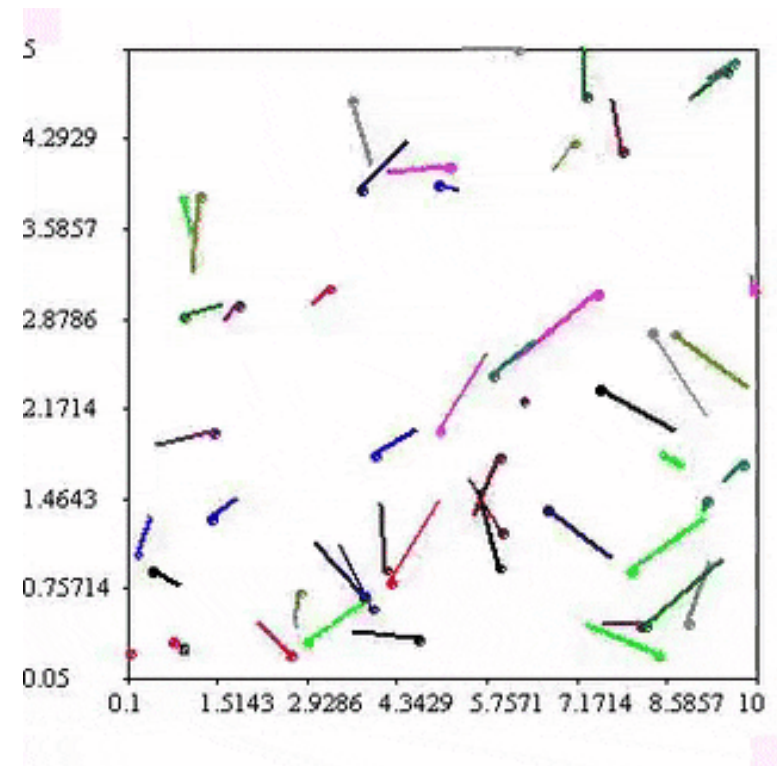
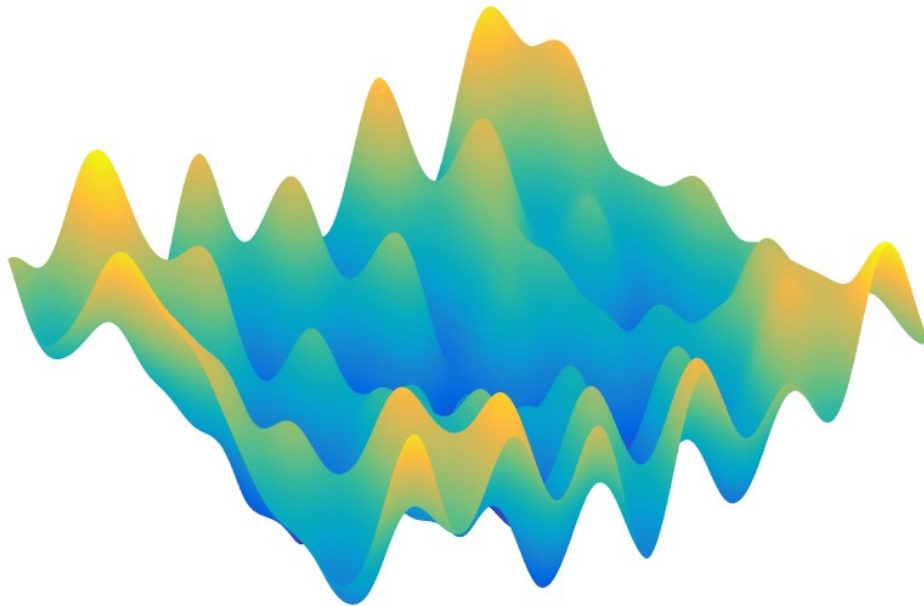
# Artificial intelligence

- Using computers to solve problems that require “intelligence”
- Replicate or simulate human intelligence in machines



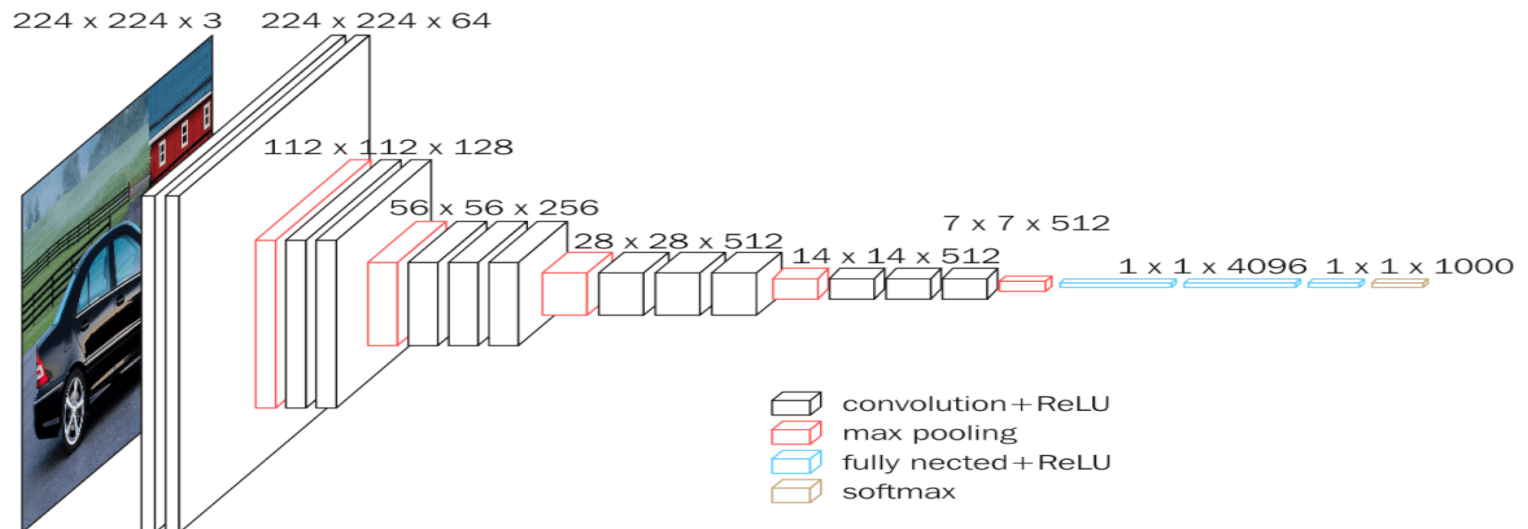
# Optimization

- Finding **optimal solution** of a problem through an iterative process



# Machine learning

- Modify itself when exposed to **new data**





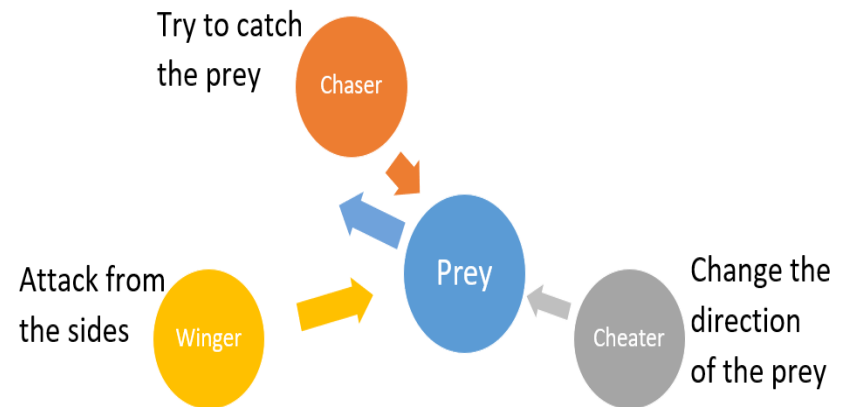
# Research topics

- Design optimization of multi-span steel box girder bridge
- Damage classification for concrete bridge decks using images
- Prediction of bond strength of steel bars embedded in UHPC

# Developing a new optimization algorithm

## Lion pride optimization algorithm

- Cooperative hunting of lionesses
- Excursion of the male lions
- Mating behavior
- Intragroup interactions between different pride groups
- Migration of lionesses from their birth pride group to another one

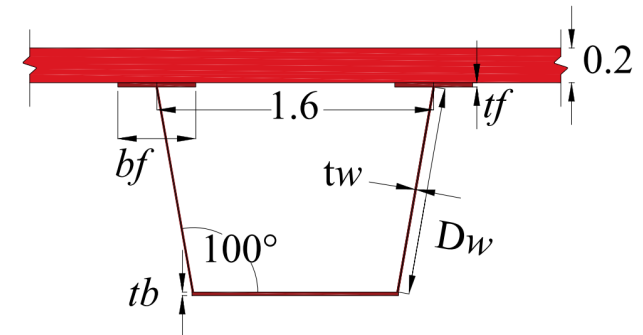
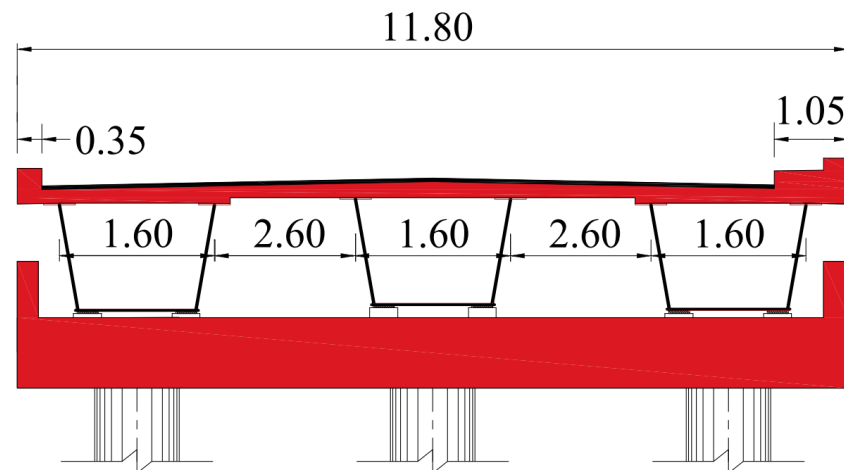




# Apply algorithm to bridge design optimization

The bridge:

- 3 continuous spans: 15 m + 34 m + 21 m
- Composite section with 3 girders
- 8 pre-built segments
- Code: AASHTO HS standard moving loads

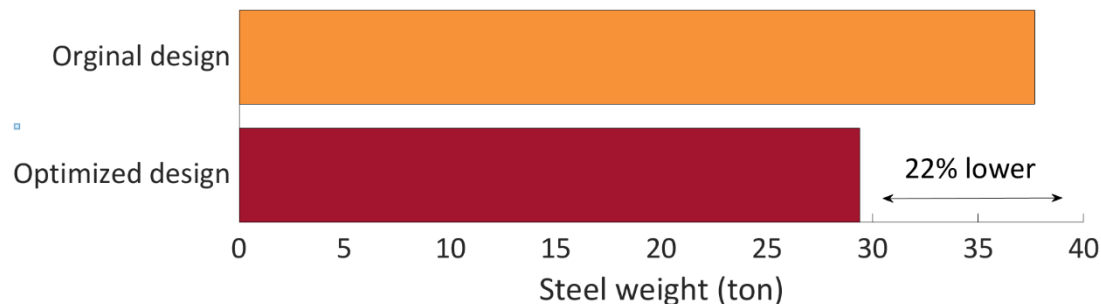
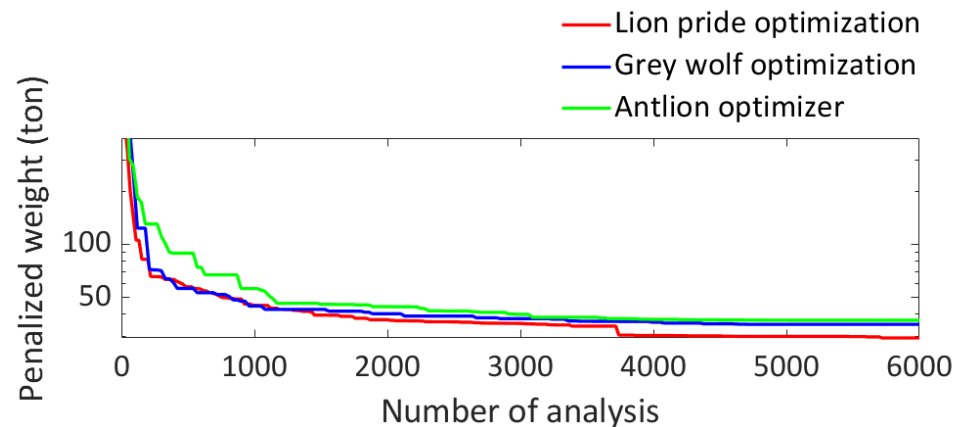


Dimensions (unit in m)

( 1m = 3.28 ft )

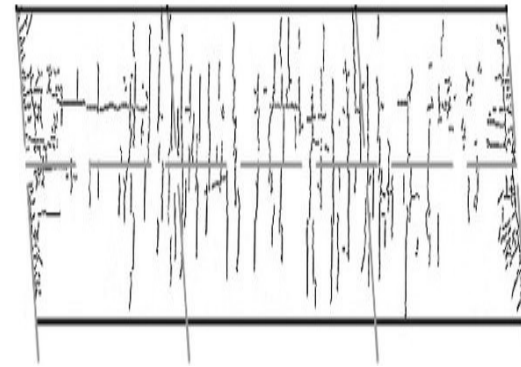
# The results

The optimization algorithm helps save **22%** material cost of the bridge while retaining the performance of the bridge.



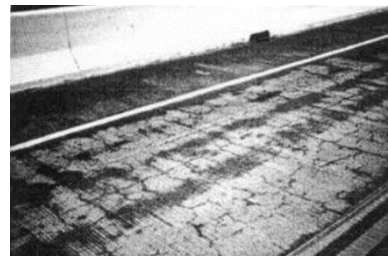
# Damage classification for concrete bridge decks using images

- Gather crack data using crack survey and getting images



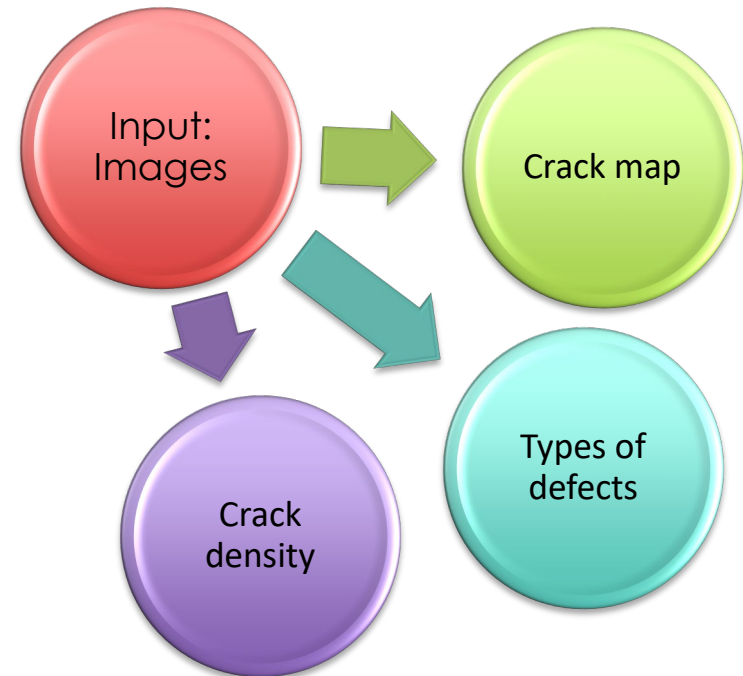
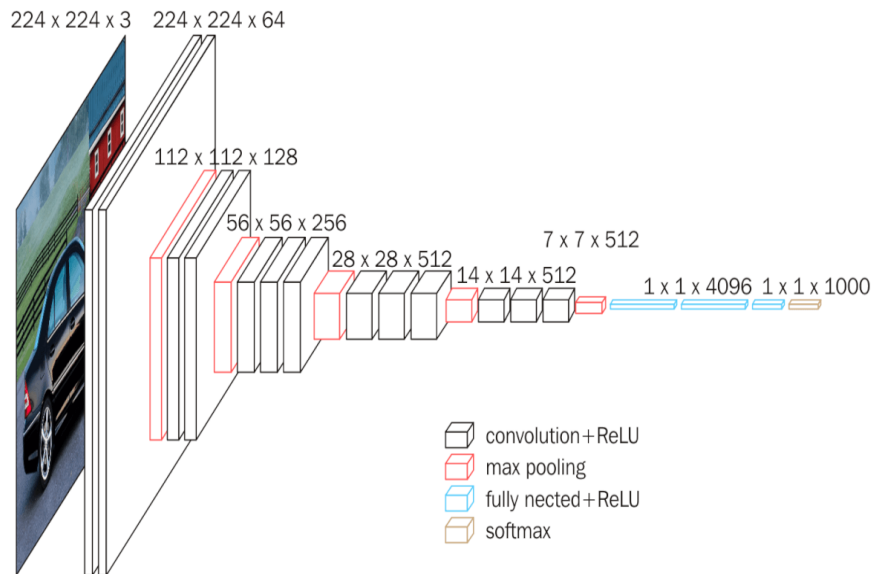
Crack map

- Classification of cracks



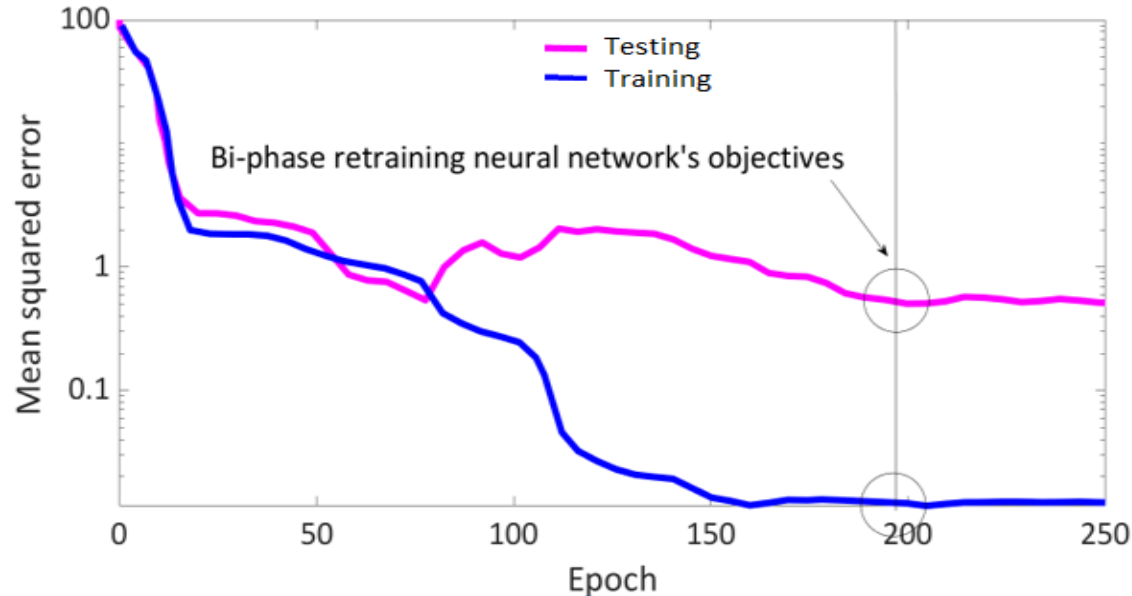
# The Input and outputs

- Method: **VGG16** (Oxfordnet)
- Different concrete deck bridges



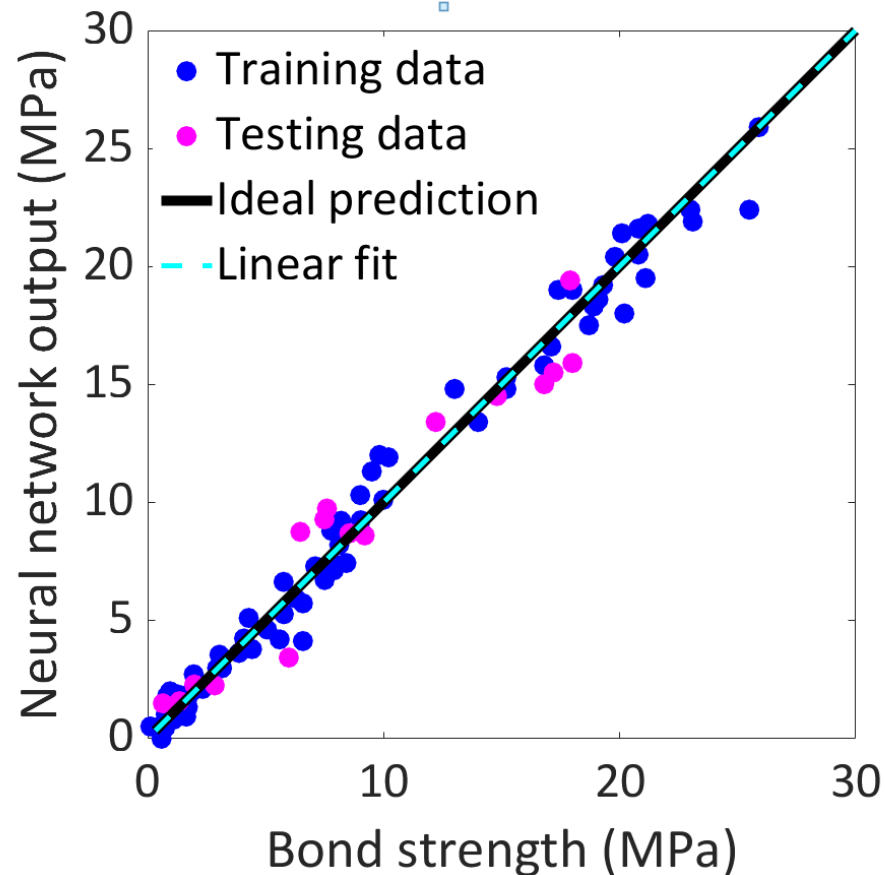
# Prediction of bond strength of steel bars embedded in UHPC

- A posteriori Pareto-front selection method: decrease total and empirical error at the same time
- Other neural networks: conventional neural network, and retraining neural network



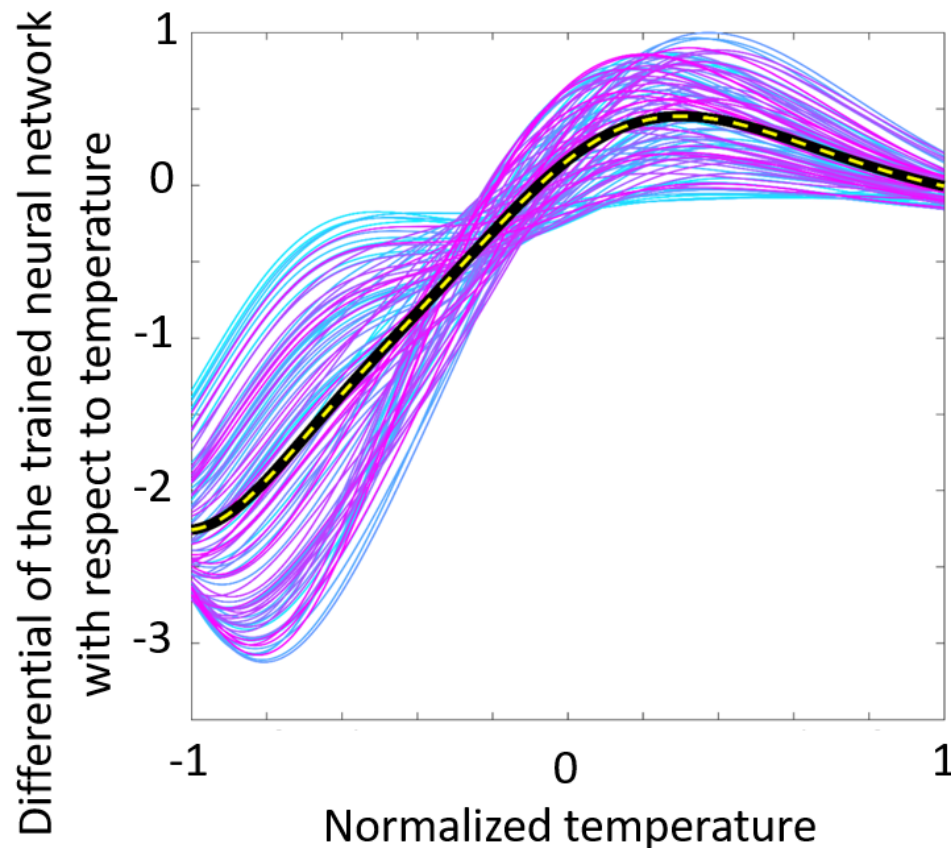
# The results

- Demonstrate desired prediction accuracy (**error** < 5%)



# Relationship between variables and bond strength

- Reveal **complicated** relationship between temperature and bond strength



# Ongoing Research

- Design of joints of prefabricated bridge components for accelerated bridge construction
- Predict the properties of high-performance fiber-reinforced cementitious composites (HPFRCC) using artificial neural networks
- Identification and classification of multiple types of defects using novel convolutional neural networks





# Conclusions

- The **lion pride optimization algorithm** helps save **22%** material cost of the bridge while retaining the performance of the bridge.
- The **VGG16** (OxfordNet) can be trained using online available images and applied to **identify cracks** in concrete bridge decks.
- The **bi-phase retaining neural network** can be trained and applied to predict the **bond strength** of steel bars embedded in **HPFRCC**. The analysis results from the neural network help reveal the **underlying effects** of the heating temperature.



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# Improving Bridge Performance Using Fiber Reinforced Polymer (FRP), Shape Memory Alloy (SMA), and Engineered Cementitious Composites (ECC)

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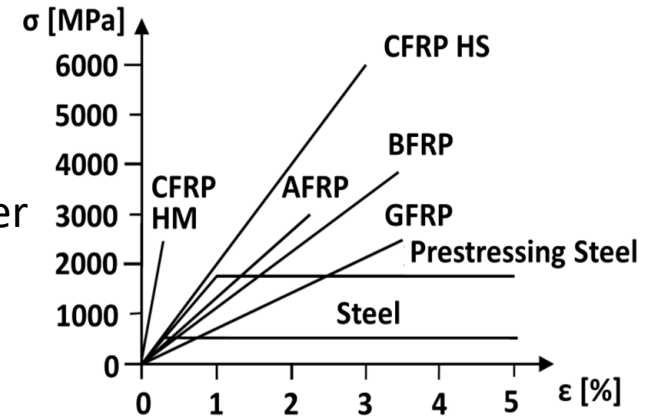


# Outline

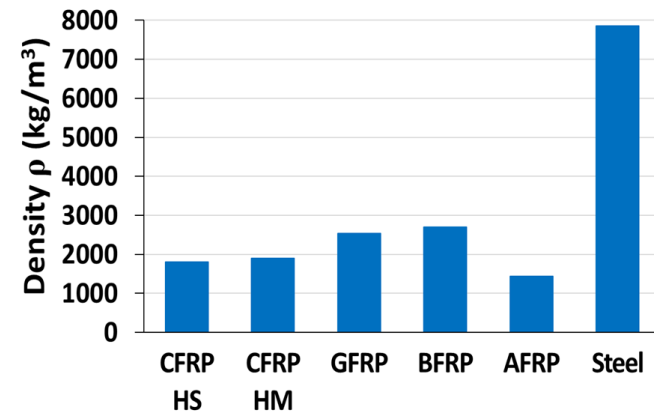
- My research aims to improve bridge performance through using innovative materials.
- This research addresses the following contents:
  - Advantages of FRP, SMA and ECC;
  - Applications in highway bridges;
  - On-going research;
  - Conclusions.

# Fiber reinforced polymers

- Combination of fibers in polymer matrix:
  - Most loading is carried by the fibers
  - Matrix provides support and keeps the fibers together
  - Different types of fibers are used
    - ✓ *Glass, Carbon, Kevlar49, Boron, Silicon Carbide, etc.*

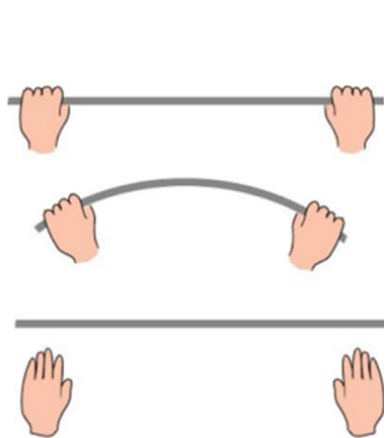


- Has many advantages
  - **High strength**
  - **Lightweight**
  - Fatigue & corrosion resistance
  - Low thermal conductivity & life-cycle cost

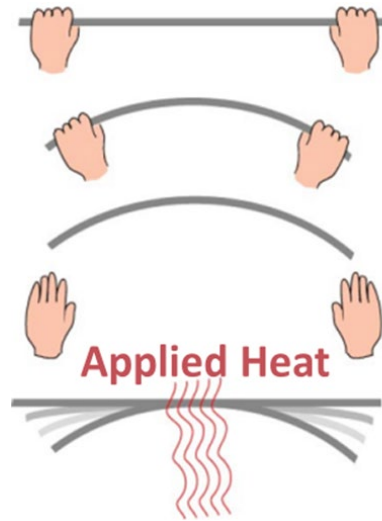


# Shape memory alloys are smart materials

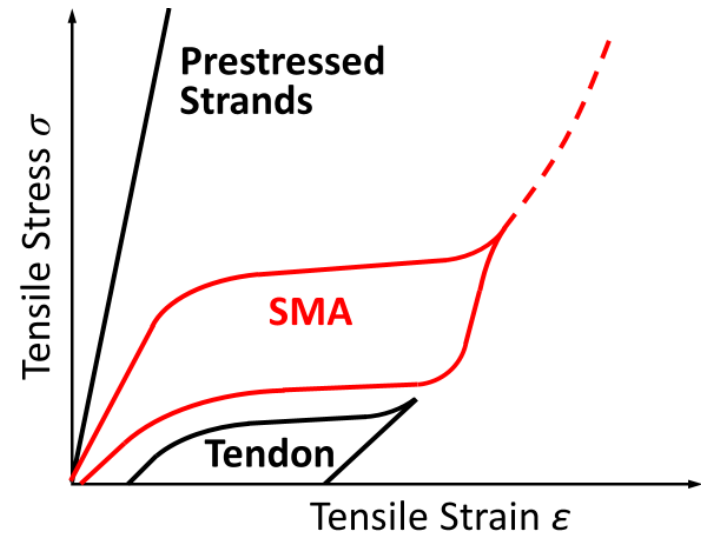
- With unique capability to “remember” the original shape:
  - **Super-elasticity**: Return to the original shape (6%~8% strain)
  - **Shape memory effect**: Recover from large deformations after heating



Super-elasticity



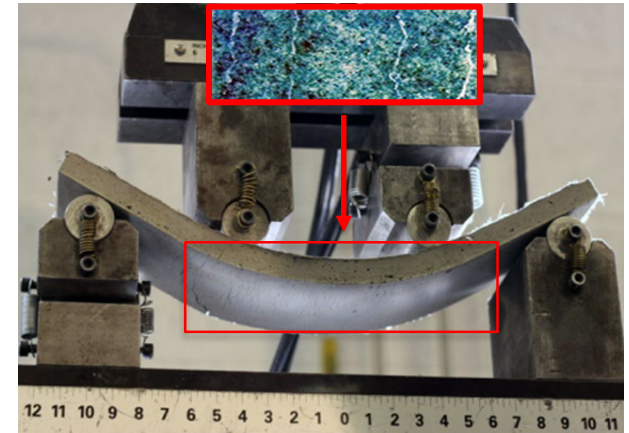
Shape memory effect



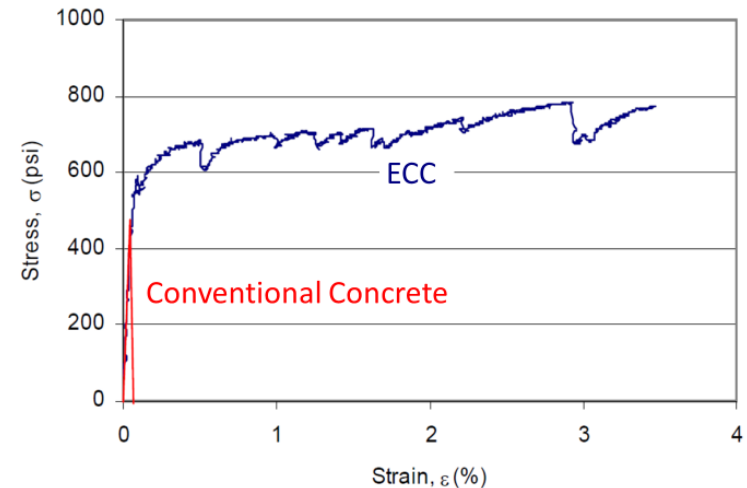
Tensile behavior of steels and SMA

# Engineered cementitious composites (ECC)

- ECC is a smart material with multiple unique properties and functions:
  - Unique mechanical properties
    - ✓ **Tensile strain-hardening**, high tensile ductility (4% strain)
  - Excellent **durability**
    - ✓ Controlled crack width, self-healing of cracks
  - Superior temperature resistance
    - ✓ High-temperature, low-temperature
  - Multi-functionality (smart functions)
    - ✓ Self-sensing, self-cleaning, air-purifying, etc.



Flexural test of ECC



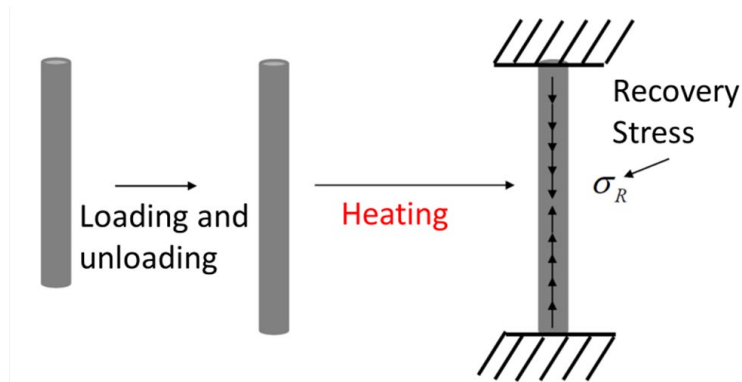


# Applications in Highway Bridges

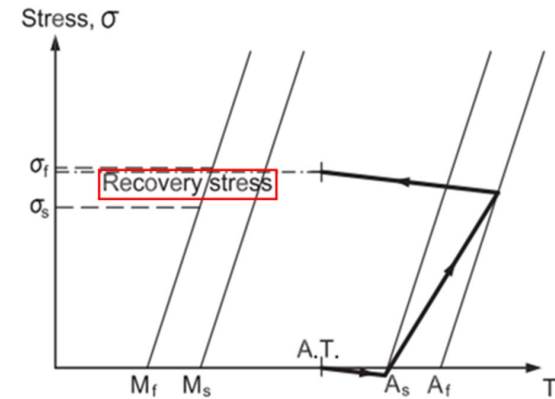
- **Lateral confinement of bridge piers**
  - Active confinement of concrete bridge piers with NiTiNb SMA spirals and FRPs
- **Innovative connection**
  - Column-footing connections in seismic zones with SMA bars and ECC
- **Bridge vibration control**
  - SMA devices for vibration isolation
  - Cable damping devices



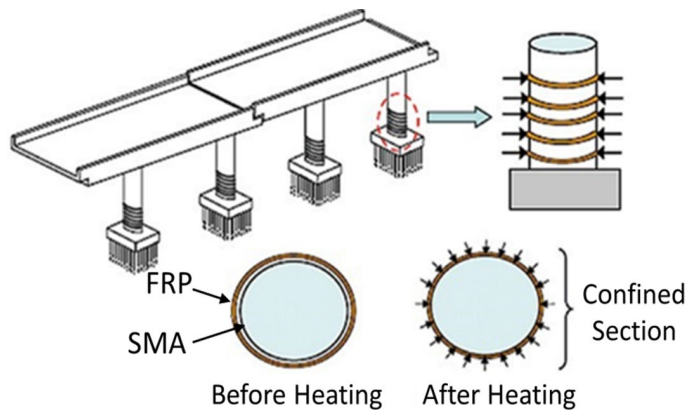
# Lateral confinement of bridge piers



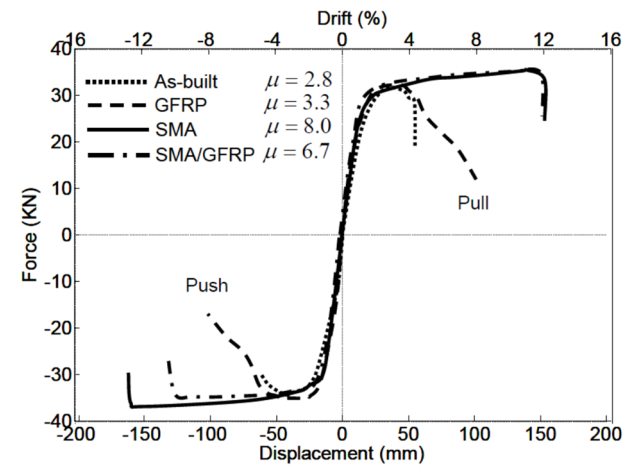
SEM in constrained recovery



Permanent prestressing after heating

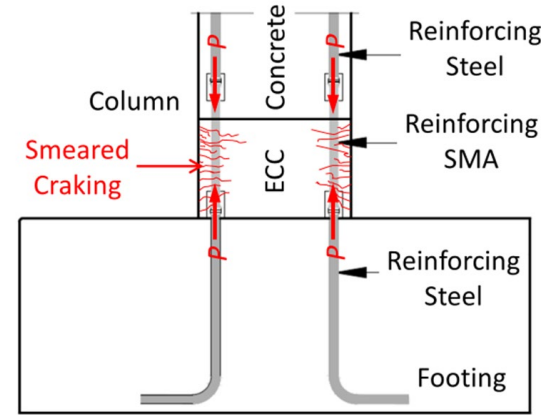
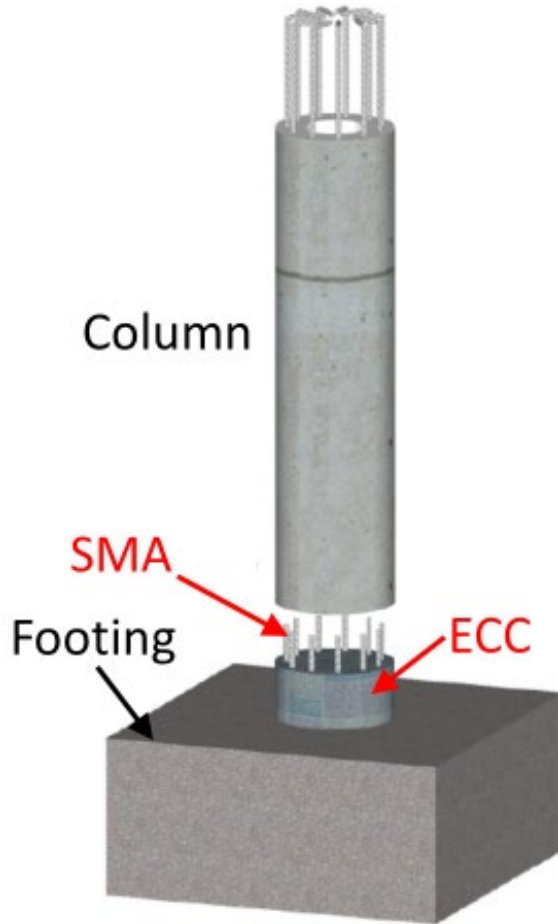


Lateral active confinement of bridge piers

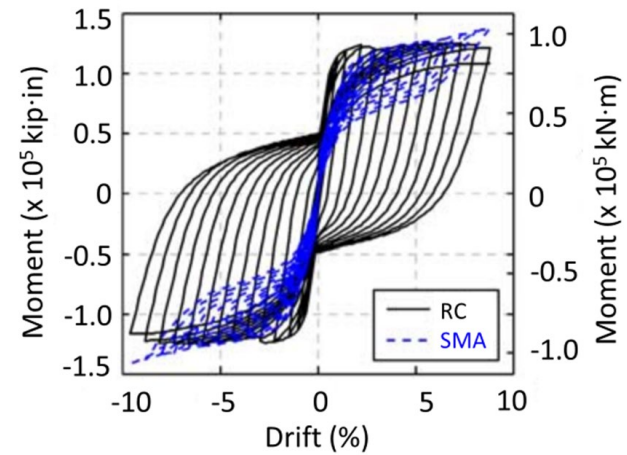


Comparison of force-displacement backbone curves of the four columns

# Innovative connection

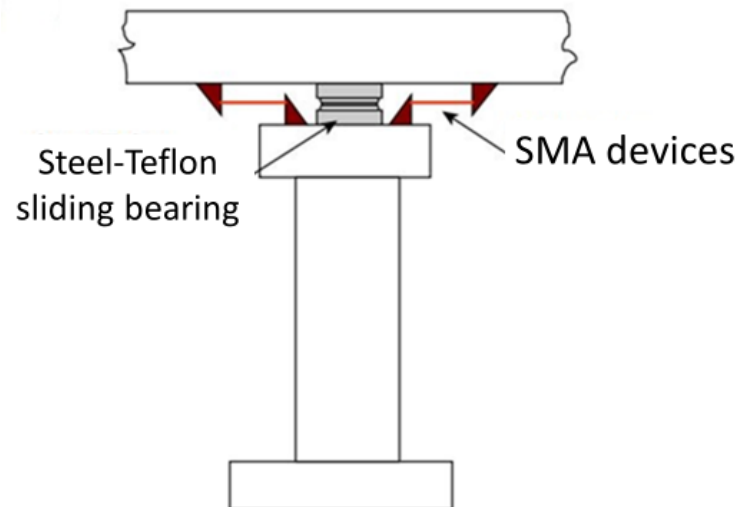


Self-centering & self-healing of cracks



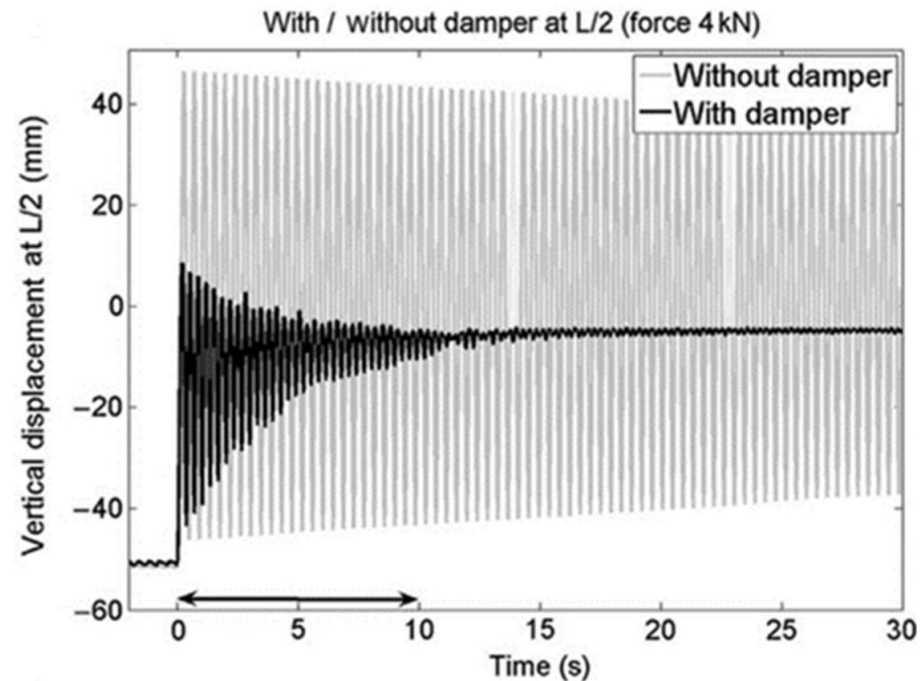
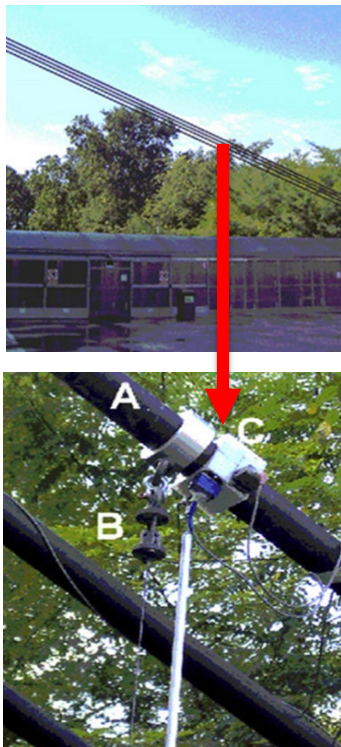
# Isolate vibration with SMA devices

- Improving the **position stability** of bridges
- Benefits
  - Improving safety and resilience under dynamic loadings
  - Convenient installation and replacement



# Cable vibration control with damping devices

- The **vibration amplitude** of cables and hangers are **reduced** by 50% using SMA dampers, increasing the service life of the cables/hangers.

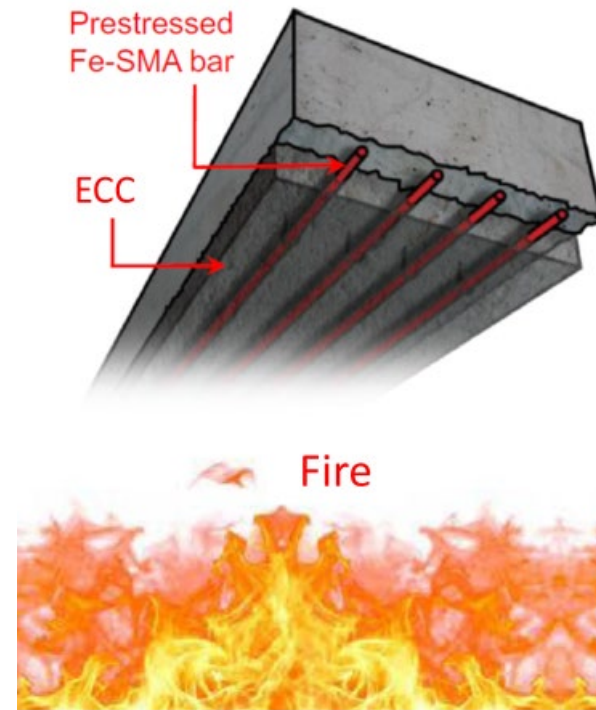


A = structural cable, B = SMA damper, and  
C = accelerometer

# On-going research 1:

## Improve fire resistance of highway bridges

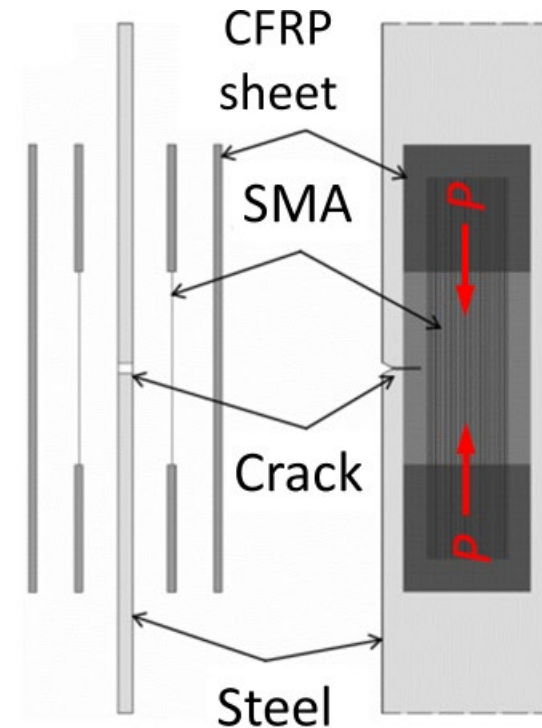
- Fire may result in permanent damage or even collapse of the bridge
- We improve the **fire resistance** using prestressed Fe-SMAs and fire-resistive ECC



# On-going research 2:

## Improve fatigue life of bridges Using SMAs and CFRP

- An **active retrofitting** technique using SMA/CFRP composite
- Crack-closing capability of SMA and fatigue resistance of FRP



# Conclusions

- The combination of FRPs, SMAs, and ECC demonstrated advantages in bridge engineering, especially in earthquake resistance design.
- **Active confinement** delivered better performance of the bridge piers compared with the passive confinement strategy.
- The piers with SMA/ECC connection recovered the position and demonstrated the minimal permanent drifts.
- The SMAs are promising to **control structural vibration, improve fire resistance, and enhance the fatigue resistance** of bridges.