2<sup>nd</sup> Energy Tech Forum



### Increasing the Energy Efficiency of Buildings using Human Cognition; via Fuzzy Cognitive Maps

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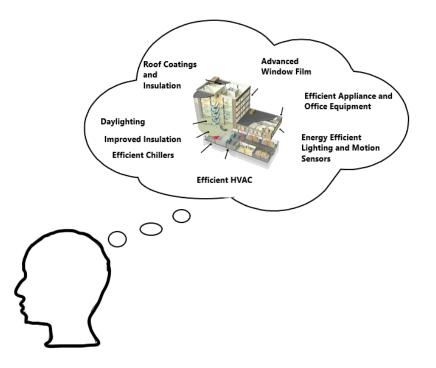
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## **Presentation Outline**

- Problem Statement
- Intelligent Buildings
- Introduction to Fuzzy Cognitive Maps
- Fuzzy Cognitive Map Modeling
  - Case study: *Reduce the consumption of a building by shifting excess loads*
- Results
- Conclusions
- Future Research

### **Problem Statement**

## How can we use human cognition procedures to achieve high energy efficiency in buildings?



## Intelligent Buildings- Definitions

#### Services based

Services offered to users:

- communication
- office automation
- building automation

Japanese Intelligent Building Institute (JIBI) System based

IBs

Integrated Technology:

- building automation
- communication automation
- office automation

Chinese IB Design Standard (GB/T50314– 2000) **Performance based** Expected Performance:

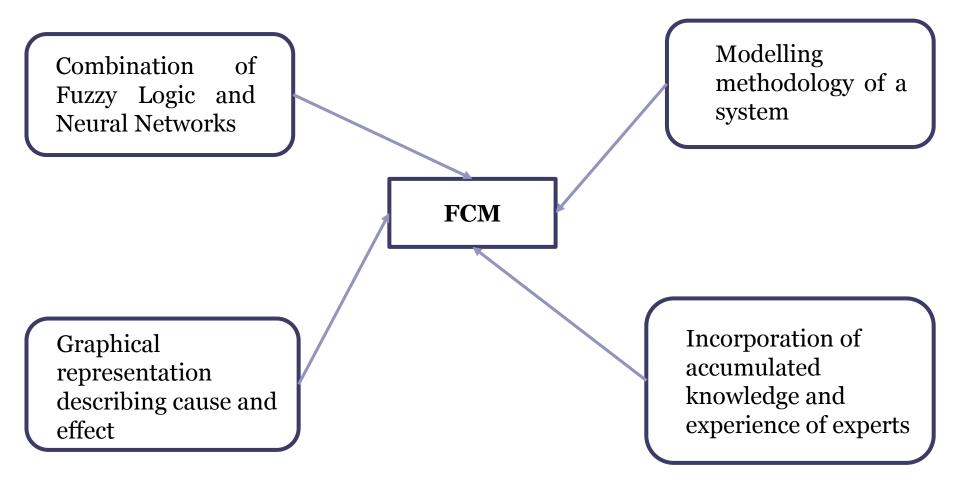
- efficient management of resources
- cost reduction
- Meet the users' needs

European Intelligent Building Group (EIGB) & Intelligent Building Institute (IBI) ,United States

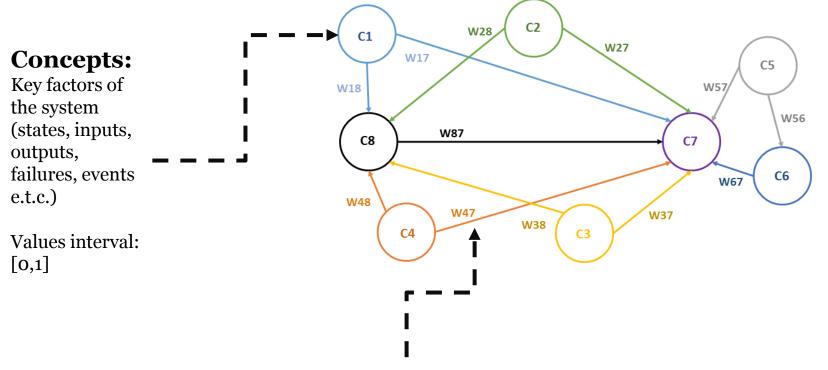
## How to create and energy efficient building

- Solar collectors for air and water heating
- Small scale solar cooling units
- Development and demonstration of standardized building components
- Software for building simulation
- Integration of renewable energy supply

## Fuzzy Cognitive Maps - An Introduction (1/2)



## Fuzzy Cognitive Maps - An Introduction (2/2)



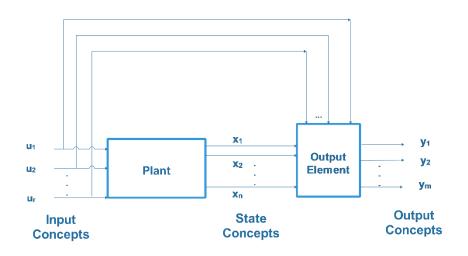
Weighted arcs: causal relationships between nodes

Values interval: [-1, 1]

- Value: strength of influence between Ci and Cj
- Sign: direct or inverse relationship
- Direction of arc: whether Ci influences Cj or vice versa

### FCM- A system's approach

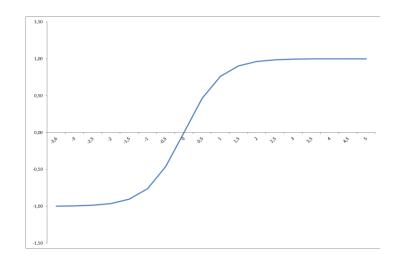
#### **State Space Approach**



$$x_{k+1} = Ax_k + Bu_k$$

$$y_k = Cx_k + Du_k$$

#### **Fitting the Inputs**



$$f(x) = m + \frac{M - m}{1 + e^{(-r(x - t_0))}}$$

- m= lower limit
- M= upper limit
- r=slope
- to= symmetry to the y axis

## FCM- Mathematical Representation

Concepts Calculation at each iteration step

$$x_{k+1} = x_k + \frac{\Delta x_{k+1}}{\sum_{j=1, j \neq i}^n |w_{ji}|}$$

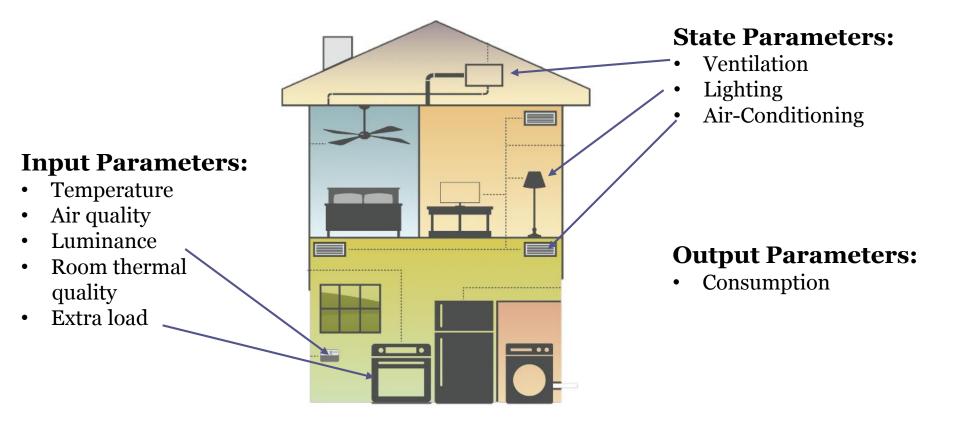
$$y_{k+1} = y_k + \frac{\Delta y_k}{\sum_{j=1, j \neq i}^m |w_{ji}|}$$

where: 
$$\Delta x_{k+1} = A \Delta x_k + B \Delta u_k$$

$$\Delta y_k = C \Delta x_k + D \Delta u_\kappa$$

## System's description

## Objective: Reduce the consumption of a building by shifting excess loads



## Fuzzy Cognitive Maps Modeling (1/3)

#### **STATES**

- C1: ventilation
- C2: lighting
- C3: air- conditioning

#### INPUTS

- C4: steptemp
- C5: stepair
- C6: steplum
- C7: roomthq
- C8: extraload

#### **OUTPUTS**

• C9: consumption

## Fuzzy Cognitive Maps Modeling (2/3)

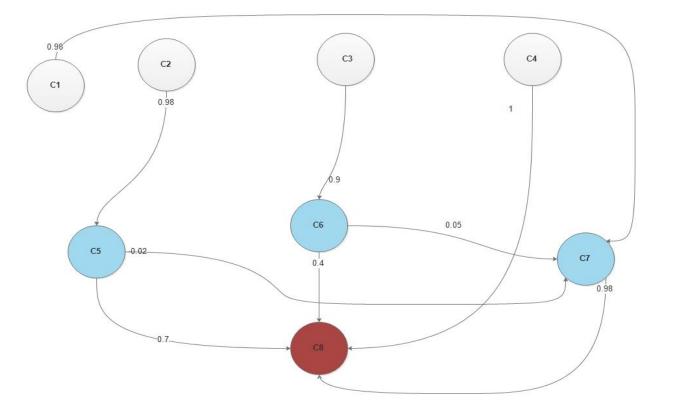
#### Initial Weight Matrix

	C1	C2	C3	C4	C5	C6	C7	C8	C9
C1	0	0	0.12	0	0	0	0	0	1
C2	0	0	0	0	0	0	0	0	1
C3	0	0	0	0	0	0	0	0	1
C4	0	0	0.98	0	0	0	0	0	0
C5	0.98	0	0	0	0	0	0	0	0
C6	0	0.9	0	0	0	0	0	0	0
C7	0	0	-0.5	0	0	0	0	0	0
C8	0	0	0	0	0	0	0	0	1
C9	0	0	0	0	0	0	0	0	0

#### **Individual Weight Matrices**

$$A = \begin{bmatrix} 0 & 0 & 0 \\ 0 & 0 & 0 \\ 0.12 & 0 & 0 \end{bmatrix} \qquad B = \begin{bmatrix} 0 & 0.98 & 0 & 0 \\ 0 & 0 & 0.98 & 0 \\ 0.98 & 0 & 0 & -0.5 \end{bmatrix} \qquad C = \begin{bmatrix} 1 & 1 & 1 \end{bmatrix} \qquad D = \begin{bmatrix} 1 \end{bmatrix}$$

### Fuzzy Cognitive Maps Modeling (3/3)



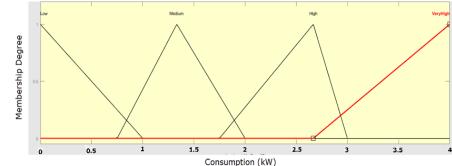
## Results (1/3)

Inputs	Case	Case	
-	Study 1	Study 2	
Internal	35	30	
Temperature			
Optimal	25	27	
Temperature			
Internal Air Quality	900	1000	
Optimal Air Quality	800	700	
Internal Luminance	100	300	
External Luminance	500	500	
Extra Load	2	4	
Room Thermal	Very	Poor	
Quality	Good		
Extra load Type	Critical	Schedulable	
Hour type	Peak	Peak Time	
	Time		

## Results (2/3)

#### **Initial Vector:**

**Case Study 1:**[1 0 1 0.5 0 0 0 0] **Case Study 2:**  $[10.66\ 0\ 1\ 0000]$ **Final Values for states and outputs:** 1:  $x = [0 \ 1 \ 0.17]$  and y = [0.84]**2**: x=[0.66 0.0 1.79] and y=[1.72] **Interpretation criterion:** 



## Results (3/3)

	Case Study 1	Case Study 2	
Consumption	Low	Medium	
Extra Load	Critical	Schedulable	
Туре			
Hour Type	Peak Time	Peak Time	
Load Shifting	Run Load	Shift Load	

## Conclusions

- Very effective and convenient method when facing complex problems, it is fast and accurate without wasting time in the mathematical modeling of the problem.
- Simplifies the study of energy saving.
- Combines the theoretical knowledge on systems' control with the experience and knowledge of experts

## Future Research

- Further improvements of the FCMs via the implementation of learning techniques, in order to adjust the FCM to the specificities of each building
- Application of the FCMs in even more complex systems i.e. buildings in order to reduce their energy consumption

## References

- Belogiannis G, Mpelogianni V and Kalamatianou A. "Modeling gender participation in the Greek university education", 16<sup>th</sup> Conference of the Applied Stochastic Models and Data Analysis International Society and Demographics, Piraeus, Greece, 2015
- Groumpos P.P., "Fuzzy Cognitive Maps: Basic Theories and their Application to Complex Systems". Fuzzy Cognitive Maps Studies in Fuzziness and Soft Computing Vol. 247,pp 1-22,2011
- Mpelogianni V., Groumpos P. "A Revised Approach of Fuzzy Cognitive Maps "In Mediterranean Conference on Automation and Control (MED), 2016 24th International Conference, 2016
- Ogata K., State space analysis of control systems Front Cover. Prentice-Hall, 1967
- Papageorgiou E. and Stylios C., "Fuzzy cognitive maps", Handbook of Granular Computing, John Wiley and Son Ltd, Publication Atrium, Chichester, England, 2008.

# Thank you for your attention Questions?

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