



Neural AD

**White Boxing Anaerobic Digestion through
Artificial Neural Networks**

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Let's model AD!

1st choice: traditional models (ADM1...)

Table 3: System of non linear equations

Biocemical rate coefficients (v_{ij}) and kinetic rate equations (ρ) for soluble...

Non-competitive inhibition

$$I = \frac{1}{1 + S_i/K_i}$$

Substrate limitation

$$I = \frac{S_i}{S_i + K}$$

Empirical

$$I = \dots$$

$$Q_{in} \cdot S_{CE}^{in} + Q_R \cdot S_{CE}^R - Q_{out} \cdot S_{CE}^{out} - Q_S \cdot S_{CE}^S = 0$$

$$Q_{out} \cdot X_{CE}^{out} - Q_L \cdot X_{CE}^L (=0) - Q_R \cdot X_{CE}^R - Q_S \cdot X_{CE}^S = 0$$

$$S_{CE}^S + X_{CE}^S = f_s \cdot (S_{CE}^{out} + X_{CE}^{out})$$

$$S_{CE}^S = \frac{f_s \cdot S_{CE}^{out} \cdot (S_{CE}^{out} + X_{CE}^{out})}{S_{CE}^{out} + f_s \cdot X_{CE}^{out}}$$

$$Q_{in} \cdot S_{AC}^{in} + Q_R \cdot S_{AC}^R - Q_{out} \cdot S_{AC}^{out} + \frac{r_{AC}}{Y_{AC}} \cdot V = 0$$

$$Q_{in} \cdot S_{ET}^{in} + Q_R \cdot S_{ET}^R - Q_{out} \cdot S_{ET}^{out} + \frac{r_{ET}}{Y_{ET}} \cdot V = 0$$

$$Q_{in} \cdot X_{AC}^{in} - Q_{out} \cdot X_{AC}^{out} + r_{AC} \cdot V = 0$$

$$\frac{X_{AC}^{out}}{X_{AC}^{in}} = \frac{X_{AC}^R}{X_{AC}^R}$$

$$\frac{X_{AC}^{out}}{X_{AC}^{in}} = \frac{X_{AC}^R}{X_{AC}^R}$$

$$Q_{CH} = 10M$$

$$Q_{CO2} = 1602$$

$$Q_R \cdot X_{CE}^R - Q_{out} \cdot X_{CE}^{out} + r_{CE} \cdot V = 0$$

$$Q_R \cdot X_{ET}^R - Q_{out} \cdot X_{ET}^{out} + r_{ET} \cdot V = 0$$

$$Q_{in} \cdot X_{CE}^{in} - Q_{out} \cdot X_{CE}^{out} + r_{CE} \cdot V = 0$$

$$Q_{in} \cdot X_{ET}^{in} - Q_{out} \cdot X_{ET}^{out} + r_{ET} \cdot V = 0$$

$$COD_{in, MAX} = \frac{Q_{in} \cdot COD_A}{Q_{in}}$$

$$\frac{X_{CE}^{out}}{X_{CE}^{in}} = f \cdot \frac{S_{CE}^{out}}{S_{CE}^{in}}$$

$$Q_S = \frac{r_{CE} \cdot V}{X_{CE}^S}$$

$$- \sum_{i=0,11,24} C_i V_{i0} - \sum_{i=1,2,13,24} C_i V_{i0} - (Y_{su}) N_{bac} - N_{aa} - (Y_{aa}) N_{bac} - (Y_{ca}) N_{bac} - (Y_{cd}) N_{bac} - (Y_{pr}) N_{bac} - (Y_{n2}) N_{bac} - (Y_{n1}) N_{bac}$$

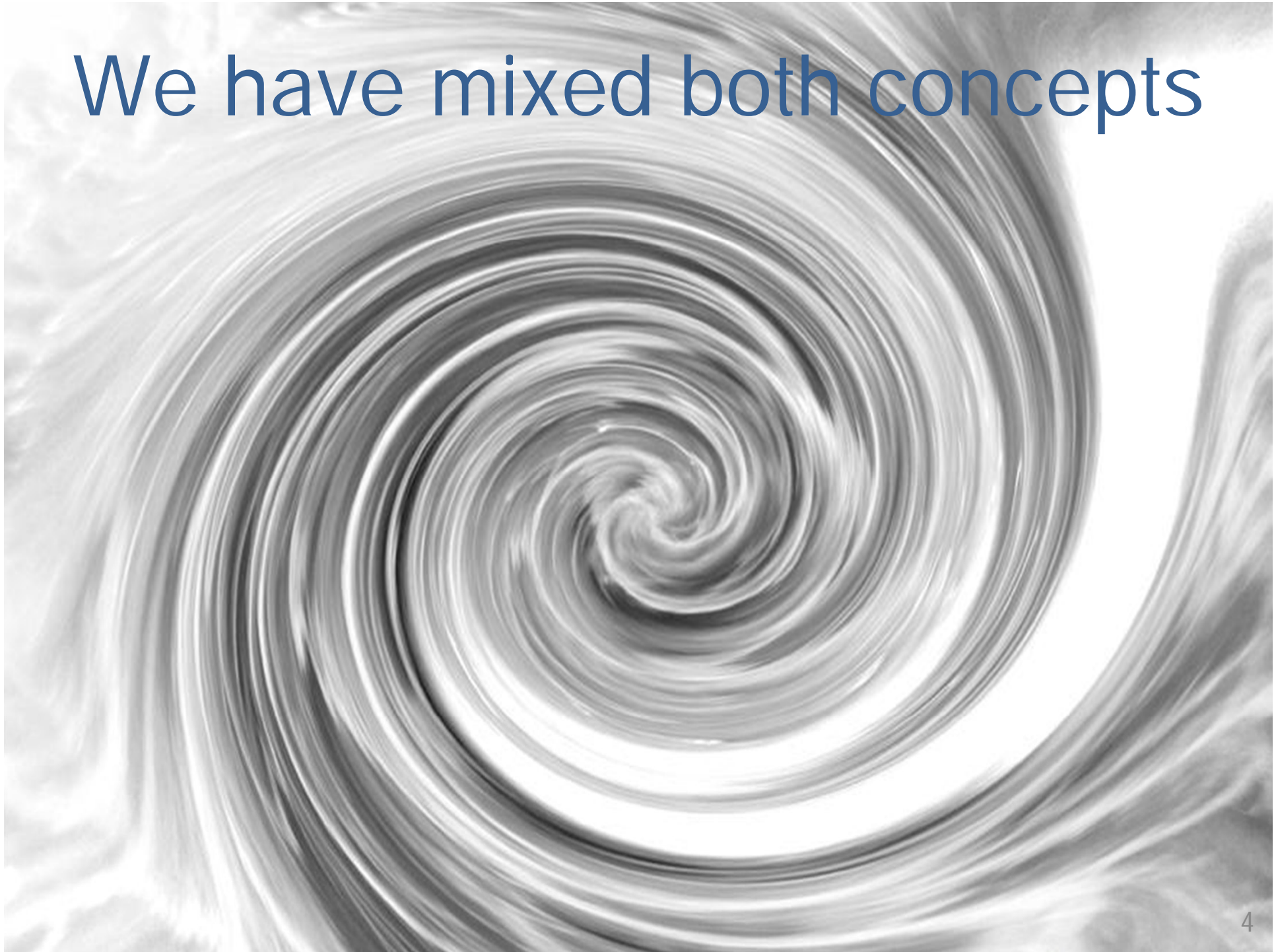
| 9 | 10 | 11 | 12 | Rate (ρ , kg COD.m ⁻³ .d ⁻¹) |
|----------|----------|----------|-------|---|
| S_{CE} | S_{IC} | S_{NH} | S_I | |
| | | | | $f_{sl,xc}$ |
| | | | | $k_{ds} X_C$ |
| | | | | $k_{hyd, ch} X_{ch}$ |
| | | | | $k_{hyd, pr} X_{pr}$ |
| | | | | $k_{hyd, n} X_n$ |
| | | | | $k_{m, su} \frac{S_{su}}{K_S + S} X_{su}/f_1$ |
| | | | | $k_{m, aa} \frac{S_{aa}}{K_S + S_{aa}} X_{aa}/f_1$ |
| | | | | $k_{m, ca} \frac{S_{ca}}{K_S + S_{ca}} X_{ca}/f_1$ |
| | | | | $k_{m, cd} \frac{S_{cd}}{K_S + S_{cd}} X_{cd}/f_1$ |
| | | | | $k_{m, pr} \frac{S_{pr}}{K_S + S_{pr}} X_{pr}/f_1$ |
| | | | | $k_{m, n2} \frac{S_{n2}}{K_S + S_{n2}} X_{n2}/f_1$ |
| | | | | $k_{m, n1} \frac{S_{n1}}{K_S + S_{n1}} X_{n1}/f_1$ |
| | | | | $k_{dec, X_{su}} X_{su}$ |
| | | | | $k_{dec, X_{aa}} X_{aa}$ |
| | | | | $k_{dec, X_{ca}} X_{ca}$ |
| | | | | $k_{dec, X_{cd}} X_{cd}$ |
| | | | | $k_{dec, X_{pr}} X_{pr}$ |
| | | | | $k_{dec, X_{ac}} X_{ac}$ |
| | | | | $k_{dec, X_{n2}} X_{n2}$ |

Inorganic carbon (kmoleC.m⁻³)
 Inorganic nitrogen (kmoleN.m⁻³)
 Soluble inert (kgCOD.m⁻³)
 Inhibition factors:
 $f_1 = \frac{1}{1 + I_1 + I_2 + I_3}$
 $I_1 = \frac{S_{NH}}{K_{i1}}$
 $I_2 = \frac{S_{NH}}{K_{i2}}$
 $I_3 = \frac{S_{NH}}{K_{i3}}$



But...
How Does
Human
Brain
Learn?

We have mixed both concepts



Our key figures



8 M PE served (Water & Wastewater)



More than 30 Anaerobic Digestions (AD)

Overall capacity ~ 160,000 m³



More than 20 WWTP with CHP

Maximum energy production potential ~ 110 GWh/yr

Energy production in 2013 ~36 GWh

Investment ~ 50 M€



Available capacity

The Biogas production black box

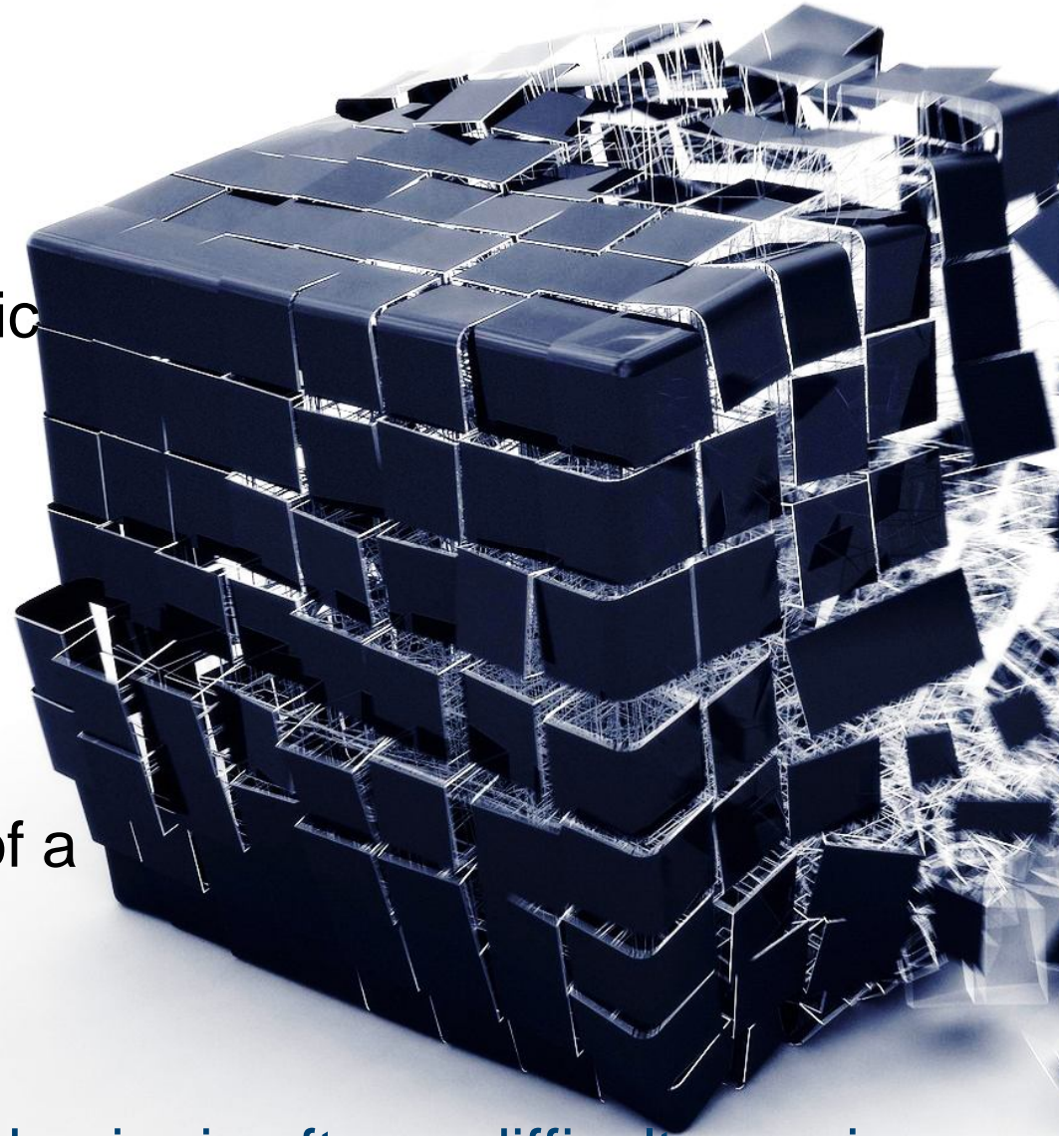
A complex system

Lag: 15 to 25 days Hydraulic
Retention Time

Cause-effect relationships
difficult to establish

Uncertainty on the effects of a
given change

Prediction of an AD plant behavior is often a difficult exercise



Our drive



WWTP Economic sustainability needs

- Less energy consumption in the treatment process
- More energy production from sewage



Biogas conversion to electricity

(and heat)

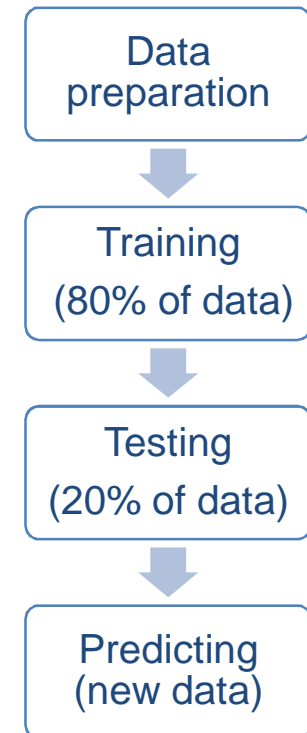
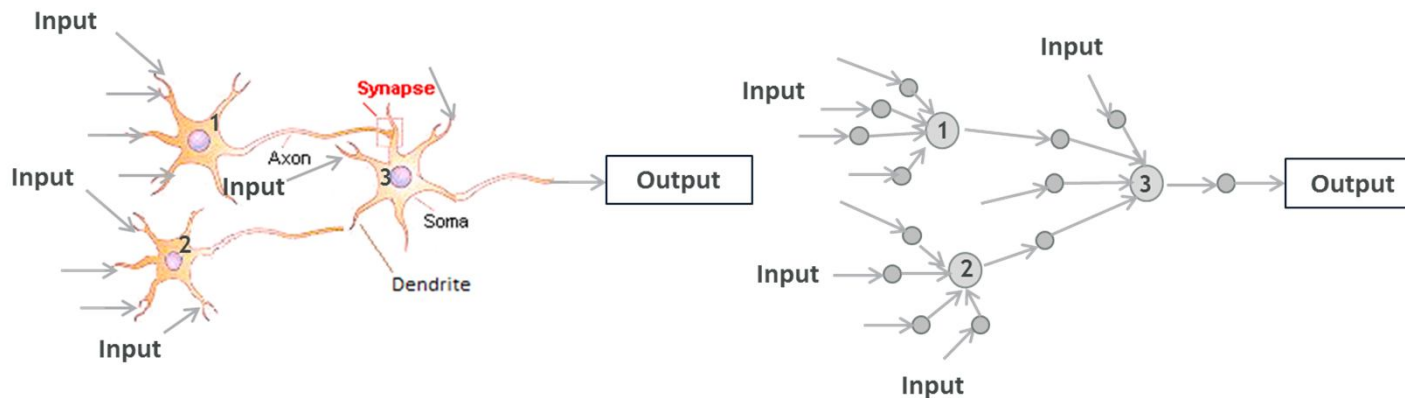


Innovative tools to help improve biogas production

Artificial Neural Networks

Linear models have proven difficult to apply to such a complex process like AD

ANN: Computational mathematical models inspired in human brain



ANN: a watch-and-learn process

Neural AD development

MODEL THE ANN USING ALL
AVAILABLE INPUTS

FEED VOLATILE SOLIDS (VS)

FEED DRY SOLIDS (DS)

ELIMINATE LESS
SIGNIFICANT INPUTS

ORGANIC LOADING RATE

HIDRAULIC RETENTION TIME

MODEL THE ANN WITH
DIFFERENT
COMBINATIONS OF INPUTS

FEED VOLUME

DIGESTER TEMPERATURE

Neural AD so far

6 different WWTP

- Ave (6,000 m³ / 800 kW)
- Norte (13,000 m³ / 720 kW)
- Sul (6,000 m³ / 660 kW)
- Vila Franca (1,800 m³ / 175 kW)
- Guia (21,500 m³ / 2,900 kW)
- Seixal (4,000 m³ / 350 kW)

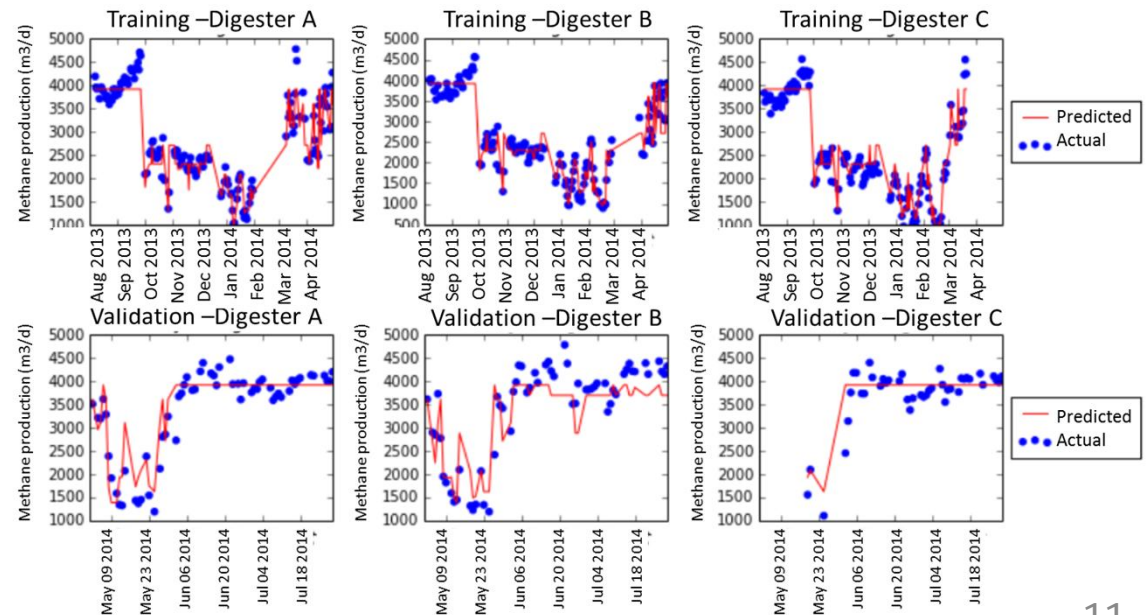
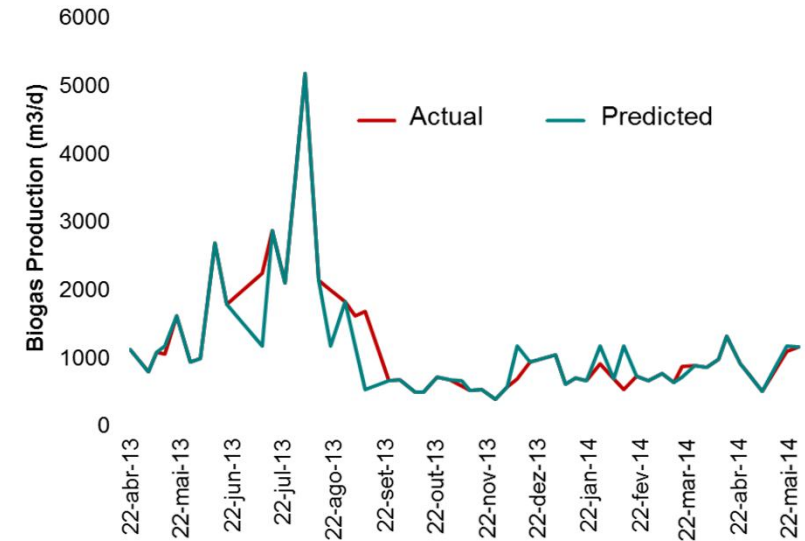
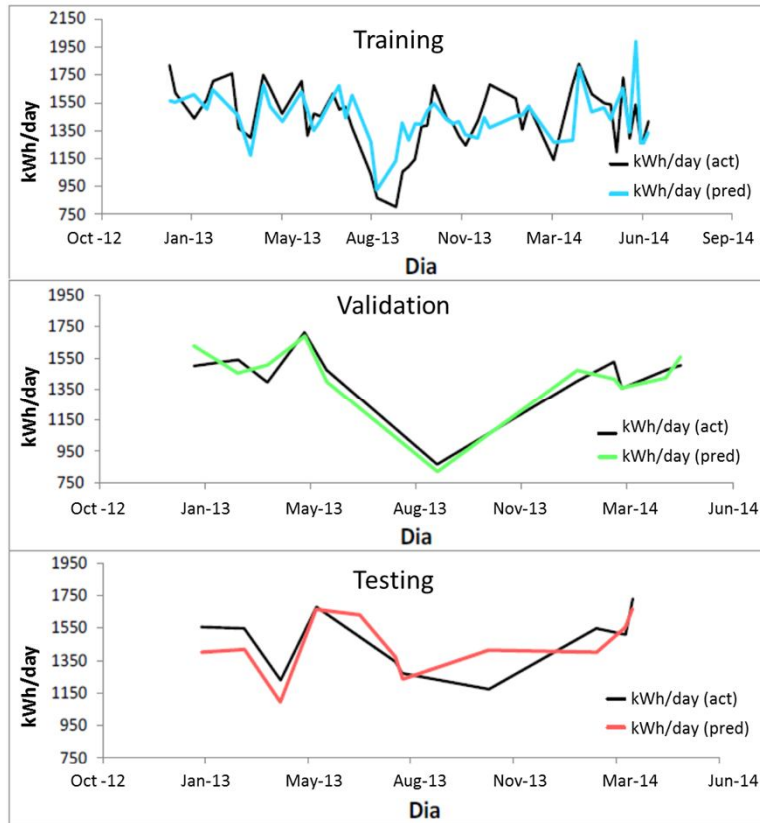
2 years (2013 and 2014)

3 different support softwares

4 Universities



Neural AD Outputs



Different Outputs

- Electrical production
- Biogas Production
- Methane Production

Our Achievements



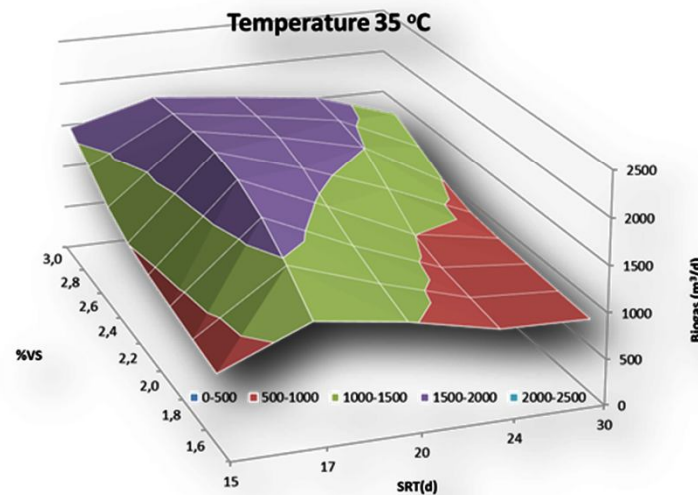
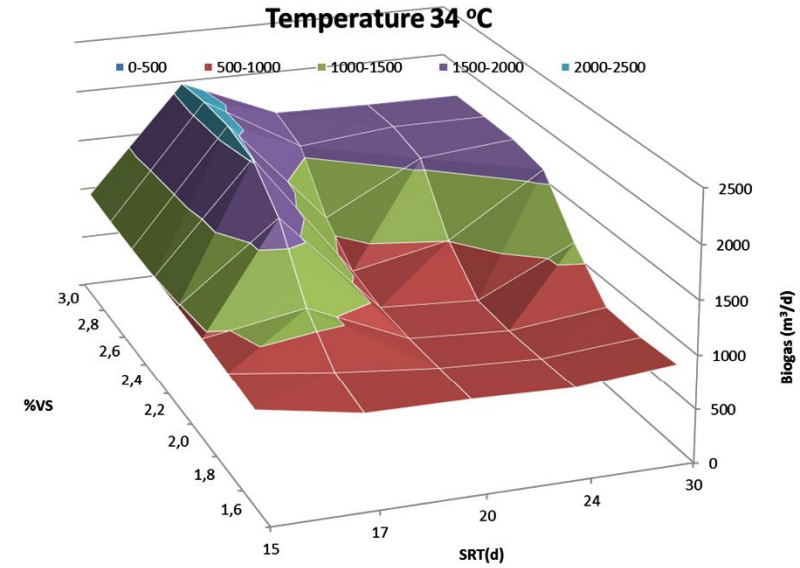
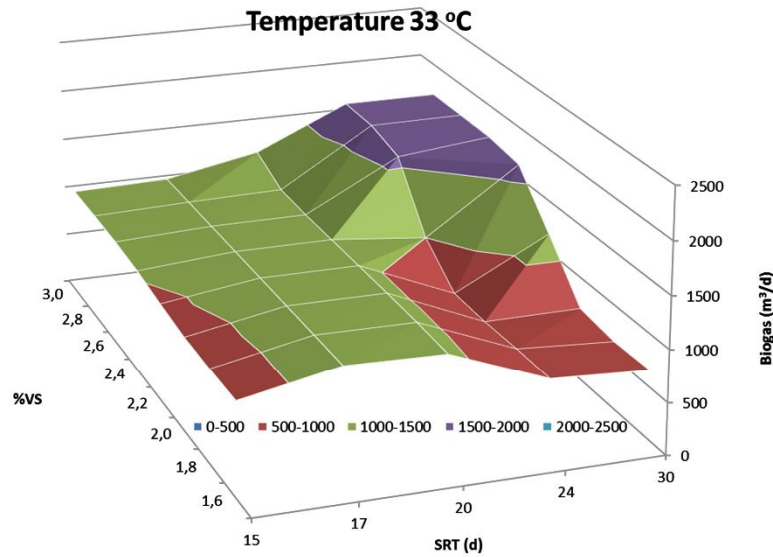
Good prediction accuracy

Few input variables needed

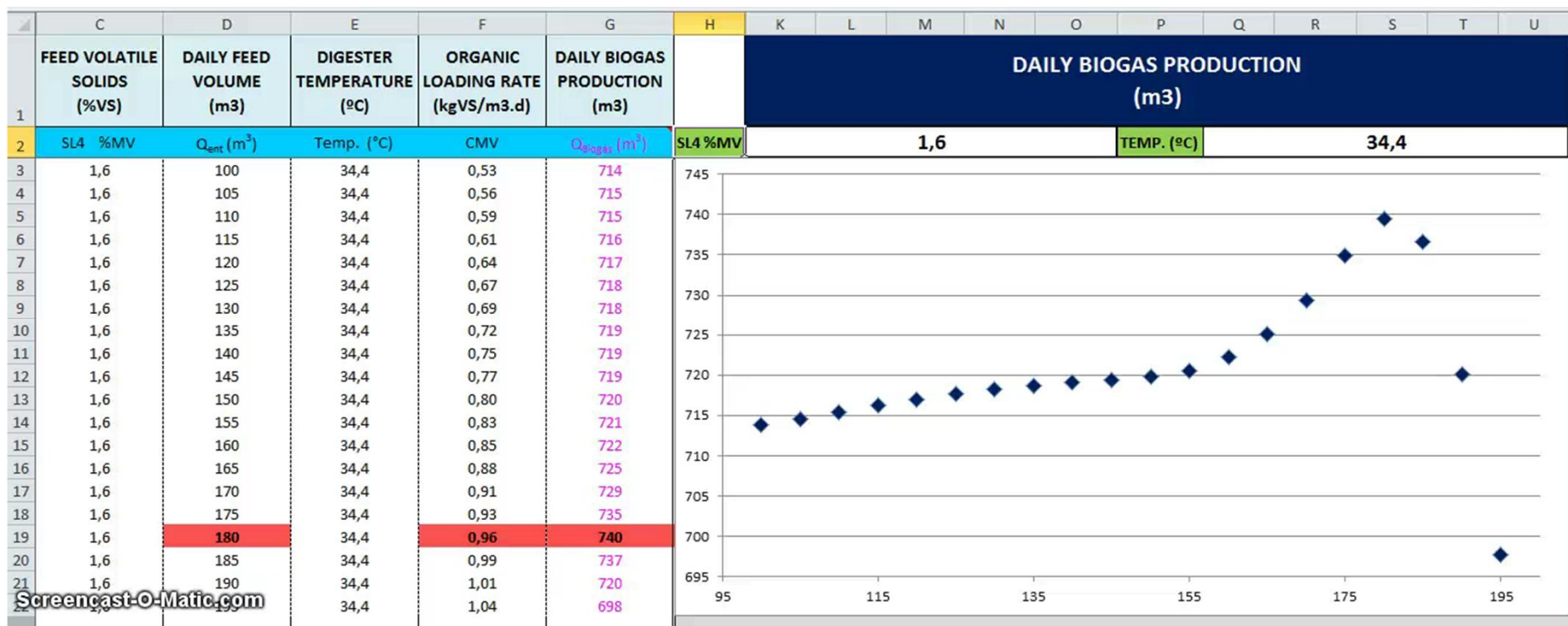
More focused WWTP's
analytical plans

Increased and stabilized biogas production

Neural AD Quick Decision Tools



Neural AD Quick Decision Tools



Next Steps

Application in other WWTP

Expansion of current datasets

Establish a common methodology to:

- Determine correct input variables
- Data treatment
- Finding the best ANN



PRODUCT:

Neural AD – a control panel for plant operators

Thank you, Partners!

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