Workability and Retardation Effects on early CSA hydration by Phosphono and Carboxylate Chemistries

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CREATING THE NEX

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## **CSA CEMENTS AS AN ALTERNATIVE TO PC**

- Calcium sulfoaluminate (CSA) cements hydrate rapidly to form ettringite
- To extend setting time beyond 30 min, important for larger scale placements, retarders are added such as citric and tartaric acids

SOME INFO ON CSA Developed in China ~1970

Calcination T is 200°C less than for OPC

🖵 Main phase ye`elimite, no alite

Gives high early strength



## **MOLECULAR MECHANISM OF CSA RETARDERS**

#### Two main mechanisms:

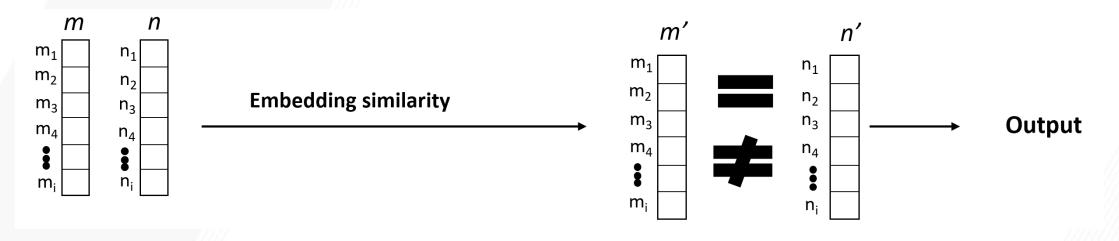
- I) Binding of calcium in solution
- 2) Adsorption onto hydrating particles

**Challenge:** How can we screen a diversity of retarder chemistries that are suitable for CSA cements?



# **CHEMINFORMATICS**

- Cheminformatics is the use of computational and informational techniques applied to a range of problems in the field of chemistry
  - Widely applied in the pharmaceutical industry for drug development through virtual screening
- In this case, quantitative methods are utilized to relate chemical structures to predict the associated increase in set time of CSA cements



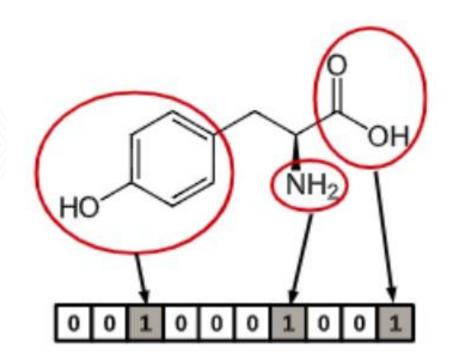
Willett, P. Similarity-Based Virtual Screening Using 2D Fingerprints. Drug Discovery Today. December 2006, pp 1046–1053. Childs, C. M.; Washburn, N. R. Embedding Domain Knowledge for Machine Learning of Complex Material Systems. MRS Commun. 2019, 9

(03), 806-820.



#### FINGERPRINT GENERATION: EXTENDED CONNECTIVITY FINGERPRINT (ECFP)

- Each group is represented in a binary vector of presence or absence. The radius chosen for this research was three, indicating that all paths of three bonds or less are represented in the vector.
  - These vectors can be folded into various lengths from 2048 down to 32 length

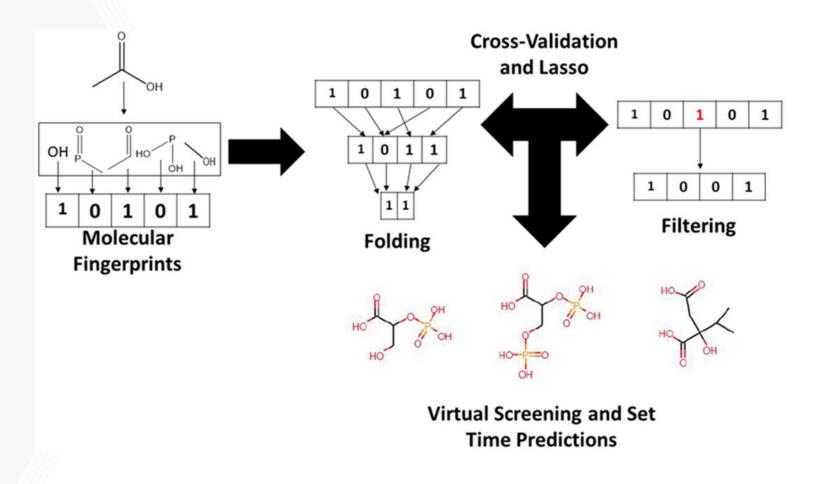


Probst, D.; Reymond, J.-L. A Probabilistic Molecular Fingerprint for Big Data Settings. J. Cheminform. **2018**, 10 (1), 66. Cereto-Massagué, A.; Ojeda, M. J.; Valls, C.; Mulero, M.; Garcia-Vallvé, S.; Pujadas, G. Molecular Fingerprint Similarity Search in Virtual Screening. Methods **2015**, 71 (C), 58–63.



# **SPARSE DATASETS AND FILTERING**

Filtering is a process of feature selection, where only the features contributing most to the variance
of the feature set are selected to model the equation

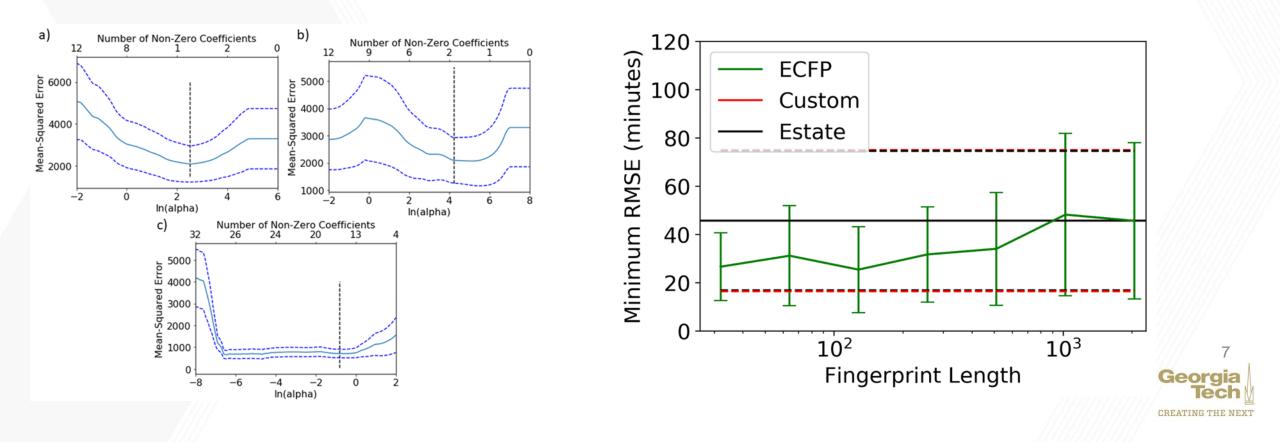


Geo

CREATING THE NEXT

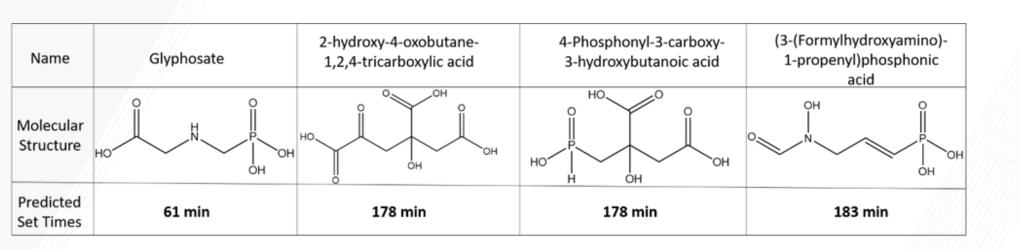
# HYPERPARAMETER SELECTION

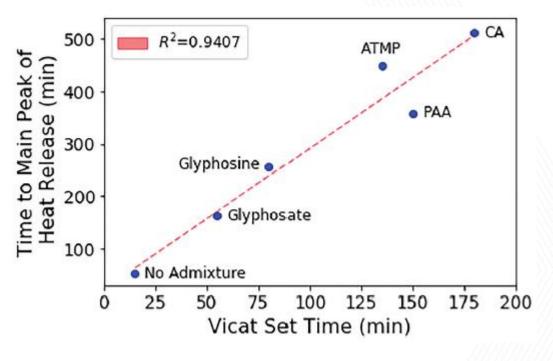
- Through cross validation, hyperparameters for both vector length (folding) and the lambda (alpha) parameter (filtering)
- The selections are conditional on minimizing the MSE, the uncertainty (standard deviation) in the MSE and having the # of features < # of training points.</li>



# **VIRTUAL SCREENING**

- The molecular structures of the three highest predicted set times, from 500,000 molecules downloaded in PubChem, are shown in the bottom figure
- Glyphosate was also predicted to extend set time beyond
   I h and is a commercially available compound at costs
   comparable to citric acid.
- Glyphosate was found to have a set time of 55 min, within the predicted range of error of +/- 26 min.





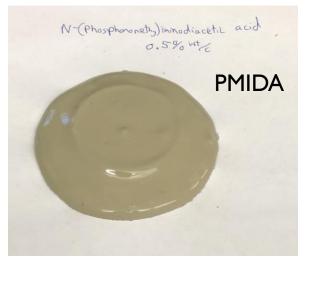
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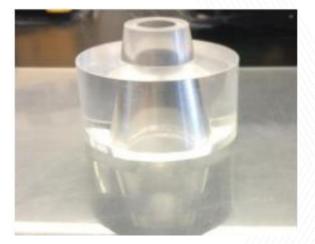
#### ANOMALOUS PLASTICIZATION BY PMIDA (THE BOTTOM RIGHT CHEMICAL)



Nitrilotri (methylphosphonic) Acid 0.5% ATMP





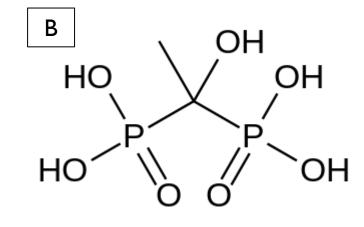


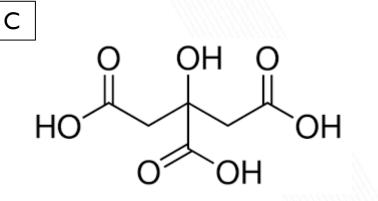


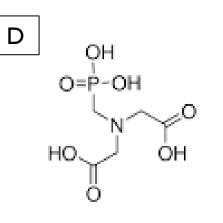
# CHEMISTRY

Labels for presentation:

- A None
- B Etidronic acid
- C Citric acid
- D PMIDA (the bottom right chemical)
- E PBTCA
- F ATMP







OH

ΟН

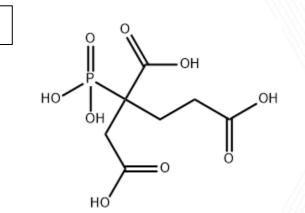
F

HO~

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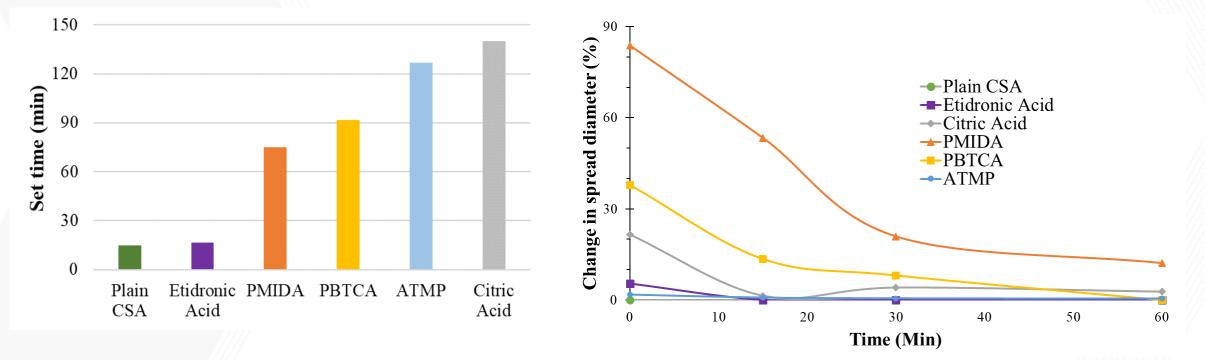


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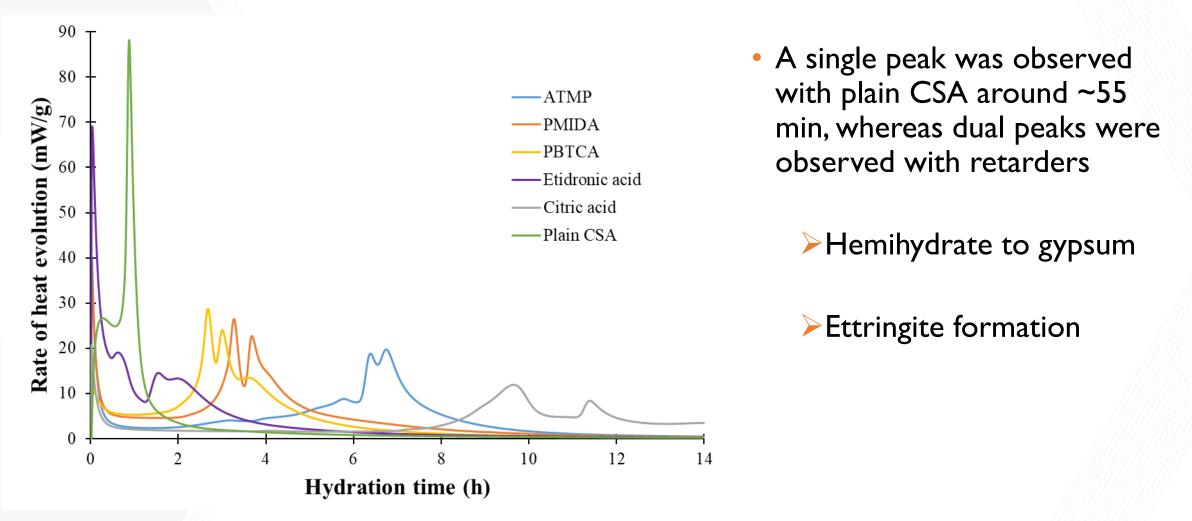
#### SET TIME AND MINI SLUMP SPREAD VARY SIGNIFICANTLY ACROSS RETARDERS

- Although Citric acid exceeds PMIDA on Vicat retarding time by 65 min, PMIDA maintains slump throughout the entire first 60 min.
- By 90 min, no further spread was observed for any of the retarders



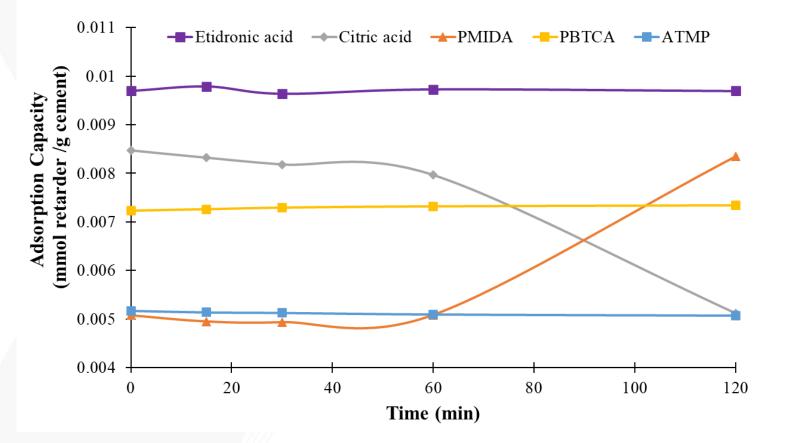


## **Calorimetry curves show similar trends to set time**





# **TOC ADSORPTION**

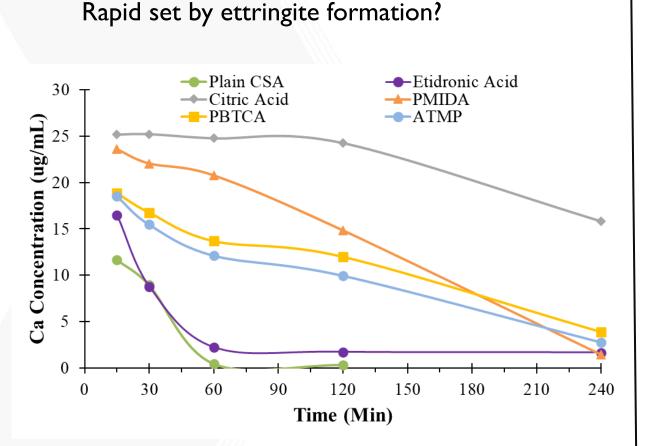


- Relatively lower adsorption is observed with PMIDA that leads to higher spread
- Decreasing citric acid adsorption but increasing PMIDA adsorption over time



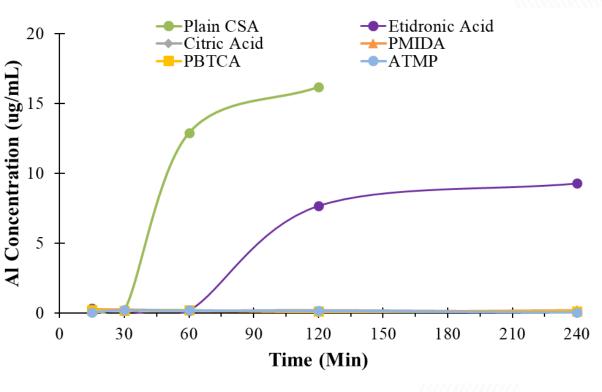
# **ICP Pore Solution Concentrations of Ca and Al**

■ Plain CSA and etidronic acid → Low Ca concentration in pore solution



• Retarders except etidronic acid  $\rightarrow$  Almost zero Al concentration in pore solution

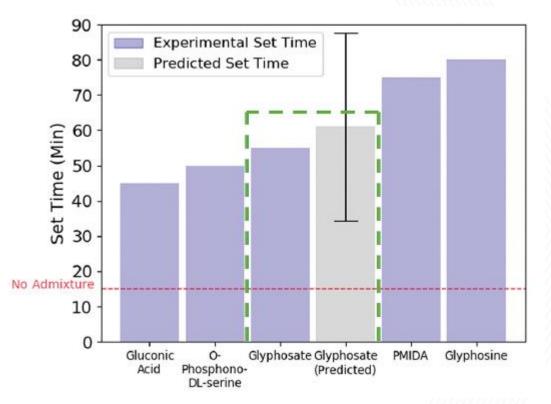
Curbed ye`elimite dissolution?





# CONCLUSIONS

- Cheminformatics was used to accurately predict set time for anionic retarders
  - We identified glyphosate as a novel set retarder for CSA

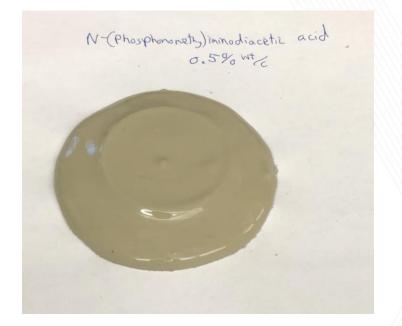




# CONCLUSIONS

 Screening a small library of anionic set retarders led to the observation anomalous plasticization by PMIDA

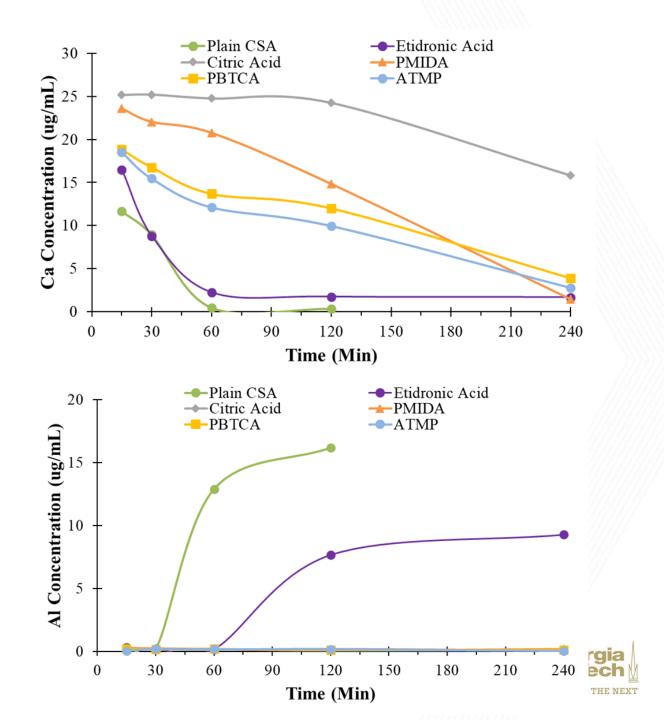
 Set time around 75 min with mini slump spread retention





# CONCLUSIONS

- Mechanistic studies indicate a complex relationship between setting and plasticization
  - Adsorbed retarders preventing dissolution
  - Retarders in pore solution binding calcium and possibly other phases



# Acknowledgements

- The Advanced Research Projects Agency-Energy (ARPA-E)
- Special thanks to ARPA-E team and particularly Dr. Joseph King for his insightful comments



Advanced Research Projects Agency • ENERGY

