April 14, 2021

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Development of a deployable plastic sorting and decontamination system



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DARPA ReSource Program

- Military logistic support has a large human cost in contested environments with no ability to create valuable materials when and where needed.
- DARPA's ReSource program aims to revolutionize how the military procures critical supplies on the battlefield by engineering self-contained, integrated systems that rapidly produce large quantities of supplies from feedstock collected on-site.
- Products include lubricants, adhesives, tactical fibers, potable water, and edible macronutrients.
- Developed technologies will function simply, reliably, and needing limited servicing in isolated environments.
- Warfighters will be able to turn forage wastes into lubricants and nutrition, supporting independent expeditionary units and Humanitarian Assistance and Disaster Relief (HADR) stabilization operations.
- https://www.darpa.mil/program/resource

Military Applications for Technology

- Expeditionary Scenario
 - Soldiers need supplies and generate waste
 - New supplies need to be delivered and waste needs to be transported out
 - Risk to personnel and equipment in hostile environments
 - Expeditions can be limited by ability to receive new supplies
- Disaster Recovery/Stabilization Scenario
 - Response to a natural disaster such as a hurricane, tornado, earthquake, etc.
 - Waste is everywhere, but it is all unusable





Current Waste Management Strategy

- MSW is a highly heterogenous feedstock
 - Variable dependent upon location, residential/industrial, season, MRF/no MRF, etc.
- Disaster Recovery/Stabilization Scenario
 - Landfill
 - Incineration
- Expeditionary/Special Operations Scenario
 - Transport in new, transport waste out
 - Roadside dumps, incineration
- Challenges/limitations
 - Wasteful
 - Environmental harm
 - Detection/tracking



Project Objectives

- INL's Objectives
 - Phase 1: Build one system to support Stabilization/Expeditionary scenarios
 - Make clean, on-spec feedstocks
 - Decontaminate and purify waste into usable feedstocks
 - Sort waste into compatible bins
 - Feedstock specs determined by downstream conversion performers
 - Meet strict size, weight, and power requirements



Research Plan Overview

 Primary Goal: Produce on-spec feedstocks for performers completing conversion/upcycling tasks

- Manage feedstock variability
- "One-pot" pretreatment and decontamination
 - Solvent extraction to remove contaminants, inks, plasticizers, organics

- Clean and modify?
- Back-up/supplementary aqueous washing system
- Automated sorting of clean polymers
 - By plastic type (1-6) and paper
 - Size reduction of sorted polymers

Sorting and Decontamination System Process Flow



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Preprocessing and Sorting System Design



Preprocessing and sorting system rendering with covers removed

Raw Data for NIR Model Development

- Training and validation datasets generated
- Clean MSW used
 - #1 PET
 - #2 HDPE
 - #3 PVC
 - #4 LDPE
 - #5 PP
 - #6 PS
 - Paper
- 1775 datasets generated
- 1st derivative data used for model development
- Variability seen between and within sample types



Spectral Data (log10(1/R)) of paper and plastics #1-6

Plastic Identification by NIR Model

- Model type: PLSDA
- Included Wavelengths: 751-2500 nm
- Preprocessing: First Derivative and Autoscale
- <u>Result: 8 Latent Variables</u>
 <u>needed</u>
- Plastics identifiable with 4 LVs
- #4 LDPE, #5 PP, #6 PS, show higher error rates
 - Model is continually being refined



Latent Variable

Problematic Outliers





- Multiple spectra taken from different locations on this HDPE juice bottle.
- The spectra indicate that the material is non-homogenous.
- In the current model this sample would be rejected as "unknown".

Dewater, Drying, Extraction Process Being Adapted for Pretreatment and Decontamination System



Pretreatment and Decontamination System



10L solvent extraction system

- Commercial Modular L-S Solvent Extraction Platform
 - Compressible solvent (refrigerant)
 - Dimethyl ether (DME) will be the starting solvent
 - 100+ cycles per solvent charge
 - Avoid carrying recharge solvents in field
 - Easily modified and scalable
- System will clean, decontaminate, and possibly modify waste materials

Molecular Dynamics Model of DME Interactions



Screenshot of MD animation of interaction between PET (large molecule), DME (red/green), and water (red/white) on Statement A: Approved for public release; distribution is unlimited.

- Developing molecular dynamics model of DME interactions
 - This will allow us to virtually test a variety of reaction conditions before entering the lab
 - Enable the evaluation of many other solvents or modifiers
- Preparing animation of MS simulation of PET/DME/water
 - Large molecule is PET
 - Red/white molecule is water
 - Red/green molecule is DME

Acknowledgements

- Principal Investigator: Jeff Lacey
- Project Manager: Seth Snyder
- Personnel Manager: Fred Stewart
- Spectroscopy: Lorenzo Vega, Blesson Isaac
- Robotic development: Blesson Isaac, Victor Walker
- Solvent decontamination: Aaron Wilson, Hyeonseok Lee, Chris Orme

This research was developed with funding from the Defense Advanced Research Projects Agency (DARPA).

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Artificial Neural Network (ANN) for MSW Characterization

Problem Statement

- MSW represents a valuable and plentiful source of low-cost feedstock, but its heterogeneity and variability are significant barriers to the application of state-of-the-art mechanical sorting devices.
- Each energy conversion pathway has different critical material attribute requirements for desired MSW feedstock.
- Sorting operations cannot manage MSW heterogeneity, variety, value, and contamination if they cannot measure it, which is why we are proposing to digitize the waste stream.

Project Impact

Project Goals/Objectives:

- Demonstrate a multimodal ANN-based technique that can identify MSW material categories at >95% classification accuracy.
- Identify reduced sensor and spectrum ranges to guide sensor cost reduction efforts to achieve BETO techno-economic and life cycle objectives.



Project Innovation

- Develop an ANN that can identify and characterize, in real time, the organic and plastic constituents of the municipal solid waste (MSW) stream diverted to landfill.
- **Inputs:** AMP's current vision-based ANN, near-infrared camera, mid-wave infrared, X-ray fluorescence, 3D/depth imaging, and Ramen spectrometer.
- **Output:** We will develop a new neural network architecture that fuses these sensor signals as a multimodal ANN.
- Identify the plastic and organic MSW categories at 95% purity or greater, and characterize CMAs at 80% accuracy or greater.

Project Approach



Advanced Sensing for Characterization and Sorting of Non-Recyclable **Plastics Using Sensor Fusion with Artificial Intelligence**

Objectives

- 1. Develop multi-sensor "fingerprint" for waste plastic
- 2. Develop novel classification system for waste plastics, including layered plastics
- 3. Use sorted materials in catalytic pyrolysis to identify high performing fractions

Sensors to be used: Visible, NIR, XRF



Sortera's Automated Modular Sorters



https://www.pri.org/stories/2018-01-01/mountains-us-recycling-pile-china-restricts-imports

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