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## REPORT

**TO:** House Committee on Energy and Technology  
Senate Committee on Finance

**FROM:** Shawn Nailor, Interim State CIO & Secretary

**DATE:** December 1, 2022

**SUBJECT:** Report regarding Inventory of Artificial Intelligence Usage, pursuant to 3 V.S.A. § 3305

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## I. Background

In May of 2022 the Legislature passed H410/Act 132, an Act relating to the use and oversight of Artificial Intelligence in State Government. Section 3 created an inventory of “automated decision systems being developed, employed, or procured by State Government.” Section 4 describes a report including “recommendations for any changes to the inventory, including how it should be maintained, the frequency of updates, and remediation measures needed to address systems deemed problematic.” While the inventory itself will be maintained on an ongoing basis, this report documents initial findings and makes recommendations for the questions described above.

Artificial Intelligence systems (AI) in use by the State of Vermont are considered as a component of the human system and processes they enable. Artificial Intelligences must be designed, developed, implemented, and used as a part of human processes. They must be monitored to ensure the process as a whole is meeting standards and expectations.

The goal of this inventory as it is being collected by the Agency of Digital Services Division of Artificial Intelligence is to identify the systems and processes that use artificial intelligence, especially where such usage could have impacts on Vermonters.

## II. Recommendations

### ***A. Inventory Maintenance***

The Inventory of Artificial Intelligence Usage should be maintained by the Division of Artificial Intelligence within the Agency of Digital Services.

The Agency of Digital Services (ADS) recommends that this inventory be updated as new systems and capabilities are implemented and reviewed for completeness and accuracy annually.



## **B. Remediation Measures**

Act 132 requires the identification of problematic systems based on 3<sup>rd</sup> party bias testing. As documented by the National Institute of Standards and Technologies (NIST) and other policy-making bodies, AI systems can behave problematically in ways other than biased outputs, and those issues can stem not only from the AI itself but also from its implementation and usage. ADS recommends a suite of possible remediation measures depending on the nature and impact of the issue identified. The most appropriate type of remediation will vary depending on the complexity of the process the AI supports, the impact of the issue, and the frequency with which the issue occurs. In some cases, multiple remediation measures may be required for a single issue.

### **1. Process changes upstream of the AI System**

Some issues can be remediated by injecting controls into the process the AI system supports before the steps performed by the AI system. These could include adjustments to data input into the system or diversion of cases with certain characteristics to a different system.

Example: If an AI is showing unexpected behavior based on counties with small populations, set the county to “Rest of Vermont” for cases where the county is not Chittenden.

Example: If an AI is showing unexpected behavior on cases for families with more than 4 children, divert those cases to a manual review system.

### **2. Process changes downstream of the AI System**

Some issues can be remediated by adding controls downstream of the AI system. Generally, issues that appear sporadically are better suited to downstream process changes. Depending on the nature of the impact, automated review to detect known problematic patterns could be sufficient. In other cases, selecting cases known to be at higher risk of issues for additional employee review could be a good option. Other times creating an easy appeal process might be the most appropriate solution.

Example: If an AI is showing infrequent unexpected behavior on cases for families with more than 4 children, have an employee review those determinations before providing the information to the case worker.

Example: If an AI is showing infrequent unexpected behavior on cases for families with more than 4 children, have a low-friction appeal process for the caseworker to flag cases where the reason for the determination does not align with the case history.

### **3. Changes to the AI System**

In some cases, the AI may need to be retrained. This is especially likely if the input or process has evolved from the original design. In some cases, adding some training examples may be sufficient, in other cases the model may need more extensive redesign.

In cases where continued use of the AI system would have significant adverse effects or erode trust in government institutions, the most appropriate course may be to decommission all or part of the AI system.



## ***C. Inventory Changes***

### **1. Scope**

The definition of Artificial Intelligence System in 3 V.S.A. § 3305 is narrower than that of “Automated Decision System” in this report. We recommend using the narrower Artificial Intelligence System definition in this inventory as Automated Decision Systems, as defined, include numerous apps, algorithms, spreadsheets, and personal productivity tools that present minimal risk to the state.

Some AI tools are essentially “commodity” products that pose little or no risk to the state. Examples are smart assistants on smart phones, text predictions that have become ubiquitous, and spam filters. ADS recommends scoping this inventory to products the state procures, develops, maintains, influences, or oversees, as well as any systems that are deemed to pose a potential risk to the state or Vermonters.

### **2. Elements collected**

**Bias Testing:** 3 V.S.A. § 3305 b 4 “whether the automated decision system has been tested for bias by an independent third party, has a known bias, or is untested for bias.” Bias testing is one component of ensuring AI systems behave as expected, but it is not relevant in all cases. Instead of focusing solely on 3<sup>rd</sup> party Bias Testing, NIST recommends continuous monitoring of system outcomes, as an AI which passes bias testing may behave in biased ways depending on implementation details. ADS recommends adding elements on outcome monitoring, specifically:

Monitoring In Place: Yes/No

Monitoring Results: No Issues Detected/Issues Detected/Issues Remediated

Remediation Applied: Narrative summary of remediation approach.

**Independent Decision Making:** 3 V.S.A. § 3305 b 2B “whether the automated decision system is used or may be used for independent decision-making powers.” In general, the goal of AI systems is to make some level of decision, so this answer is always “yes.” ADS recommends changing this element to focus on the autonomy of the system:

Capable of taking independent action: Yes/No

Independent Decisions: Description

Note that the inventory already has a Supported Decisions elements to describe situations where an AI functions as a support for a human to decide.

**Agencies using the system:** ADS recommends identifying the agencies directly using the system.



### III.Inventory

This inventory does not include commodity systems like intelligent assistants that come standard on mobile devices, spell checkers, spam filters, etc.

| Name  | Vendor      | State Entity | Purpose, Proposed Use   | Intended Benefits  | Capabilities in use   | Capabilities not in use  | Makes independent decisions | Decision impact type | Decision impact description                         | Supported Decisions                                    | Decision Type | Types of data inputs         | Data source process                   | Types of data generated                   | 3rd party bias test result | Data storage          | Data sharing                                      | Lifecycle cost | Cost savings | Funding sources |
|---|-------------|--------------|---|--|---|--|-----------------------------|----------------------|---|--|---------------|------------------------------|---------------------------------------|---|----------------------------|-----------------------|---|----------------|--------------|-----------------|
| Automotive Repository of Traffic Signs (ARTS) | UVM         | AOT          | Identify traffic signs and geolocate them for an inventory        | Providing an up-to-date inventory of VTrans' roadside assets           | Classify signs, track objects across monocular low frame rate imagery, estimate object distance and bearing from camera | Could be trained for other roadside assets, like guardrail or pavement markings. | Yes                         | Direct               | None  | Project sign replacement, inventory management         | Support       | Forward facing road imagery  | Images captured during annual surveys | Geolocated sign data                      | Not tested                 | Secure state database | Yes, UVM to continue development                  |                |              |                 |
| Pavement Condition Classification             | Fugro       | AOT          | Classify pavement quality   | Providing up-to-date detailed pavement condition                       | Detect pavement quality from downward facing imagery  |  | Yes                         | Direct               | None  | Project prioritization and selection, funding requests | Support       | Downward facing road imagery | Images captured during annual surveys | Pavement segment condition rating         | Not tested                 | Secure state database | Yes, in aggregates, with partners and the public. |                |              |                 |
| Crowdstrike Falcon                            | Crowdstrike | ADS          | Identify security compromise on State computers                   | Improve the security posture of the state's IT infrastructure.         | Detect indicators of compromise on workstations   |  | Yes                         | Indirect             | Can disable impacted workstations, quarantine files | Information Security activities                        | Final         | Computer usage data          | Monitored in real time on machines    | Anomalous event reports                   | Not tested                 | Secure state database |   | \$780K         |              | ADS Allocation  |
| vRealize Operations                           | VMWare      | ADS          | Optimize performance and cost of State network and infrastructure | improve efficiency and lower cost                                      | Monitor network health, recommend improvements in configuration   | Automatically make improvements in configuration                                 | Yes                         | Indirect             | Can adjust specs on servers and network components  | Incident response, device configuration                | Support       | Computer usage data          | Monitored in real time on machines    | Recommendations for better configurations | Not tested                 | Vendor stored         |   |                |              |                 |
| CloudHealth                                   | VMWare      | ADS          | Optimize performance and cost of State network and infrastructure | improve efficiency and lower cost                                      | Monitor network health, recommend improvements in configuration   | Automatically make improvements in configuration                                 | Yes                         | Indirect             | Can adjust specs on servers and network components  | Incident response, device configuration                | Support       | Computer usage data          | Monitored in real time on machines    | Recommendations for better configurations | Not tested                 | Vendor stored         |   |                |              |                 |
| Cloudability                                  | Apptio      | ADS          | Optimize performance and cost of State network and infrastructure | improve efficiency and lower cost (will replace CloudHealth this year) | Monitor network health, recommend improvements in configuration   | Automatically make improvements in configuration                                 | Yes                         | Indirect             | Can adjust specs on servers and network components  | Incident response, device configuration                | Support       | Computer usage data          | Monitored in real time on machines    | Recommendations for better configurations | Not tested                 | Vendor stored         |   |                |              |                 |
| SecureState                                   | VMWare      | ADS          | Identify misconfigurations of cloud components                    | Improve the security posture of the state's IT infrastructure.         | Monitor cloud service configurations  |  | Yes                         | None                 | None  | Cloud resource configuration                           | Support       | Configuration files          | Extracted from connected resources    | Recommendations for better configurations | Not tested                 | Vendor stored         |   |                |              |                 |



|   |        |               |   |   |                                     |  |     |          |  |   |         |                                      |   |                                      |            |                       |      |  |  |                                |
|---|--------|---------------|---|---|-------------------------------------|--|-----|----------|--|---|---------|--------------------------------------|---|--------------------------------------|------------|-----------------------|------|--|--|--------------------------------|
| Brainware   | Hyland | ADS           | Detect document types and extract data from them              | Improve efficiency of document management                       | Not yet in use                      |  | Yes | Indirect | Can classify and route documents   | Document classification                                   | Final   | Documents routed to Brainware queues | Scanned or digital documents are routed to Brainware based on expected type | Structured document content          | Not tested | Secure state database | None | \$250K Annually                        |  | Agency License SLA consumption |
| OnBase OCR  | Hyland | ADS, AOT, AHS | Digitize scanned documents                                    | Improve efficiency of document management                       | Optical Character Recognition       |  | Yes | Indirect | Converts images of documents into searchable, indexable documents        | Document classification                                   | Support | Scanned documents queued for OCR     | Documents like project design "magic boxes" are scanned and routed for OCR  | Searchable document content          | Not tested | Secure state database | None | included in Tier 2 licensing per user. |  | Agency License SLA consumption |
| Okta Adaptive Authentication / Multifactor Authentication | Okta   | ADS           | Provide secure identity and access management                 | Make robust authentication mechanisms less cumbersome for users | Adaptive Security, Bot detection    |  | Yes | Direct   | Prompts for MFA less frequently if the user is following known patterns. | MFA prompt  | Final   | User interactions                    | Authentication workflows  | None                                 | Not tested | Vendor stored         |      |  |  |                                |
| Land Cover Change Detection                               | UVM    | VCGI          | Identifies locations where land usage changes between surveys | Track changes in impervious surface and land use                | Image processing, feature detection |  | Yes | Direct   | None   | Production of maps and land use statistics, policy making | Final   | Aerial Imagery                       | Images are collected through annual surveys and processed                   | Spatial data representing land areas | Not tested | Secure state database |      |  |  |                                |

