Digitization and Capture as a Service

October 26, 2023

2023 Federal Committee on Statistical Methodology (FCSM) Research and Policy Conference University of Maryland, College Park, MD.

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Any conclusions expressed herein are those of the authors and do not reflect the views of the U.S. Census Bureau. All results were approved for release by the Disclosure Review Board of the U.S. Census Bureau (Data Management System number: DMS P-7532197, Disclosure Review Board (DRB) approval numbers: CBDRB-FY24-ERD006-001.





June 30, 2024



Why Transition to Electronic Records? Challenges of Non-Digitial Physical Records

- Limited accessibility and inefficient retrieval
- Integration challenges and lack of security measures
- Data analysis inefficiency and collaboration hurdles

- Vulnerability to damage and deterioration
- Space requirements and backup limitations
- Mobility and version control issues



Decennial Census Digitization and Linkage (DCDL)

- Final component of creating longitudinal datasets that covers most of the U.S. population since 1940
- Demonstrates the infrastructure and methodology required to digitize historical records and capture data

Methodology:

- 1. Scan microfilm reels from 1960-1990 Censuses and create digital images
- 2. Use Optical Character Recognition (OCR) and Optical Mark Recognition (OMR) to capture names and additional information
- 3. Link new information to already digitized data



National Processing Center (NPC)

The Census Bureau's Secure Scanning Facility



- Conversion of documents, books, microfilm and microfiche into digital images.
- Secure shipment, handling, and storage



Adherence to federal information security standards



High volume production scanning equipment

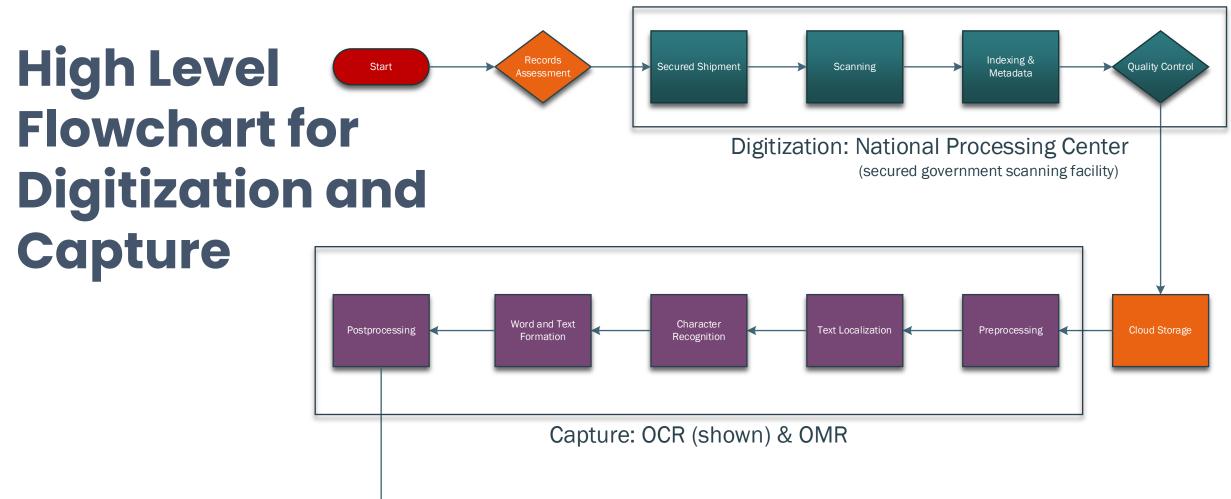


Skilled scanning operations staff, cleared and badged for secure records handling

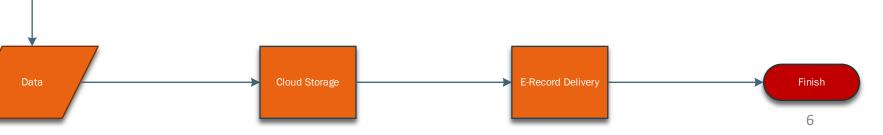


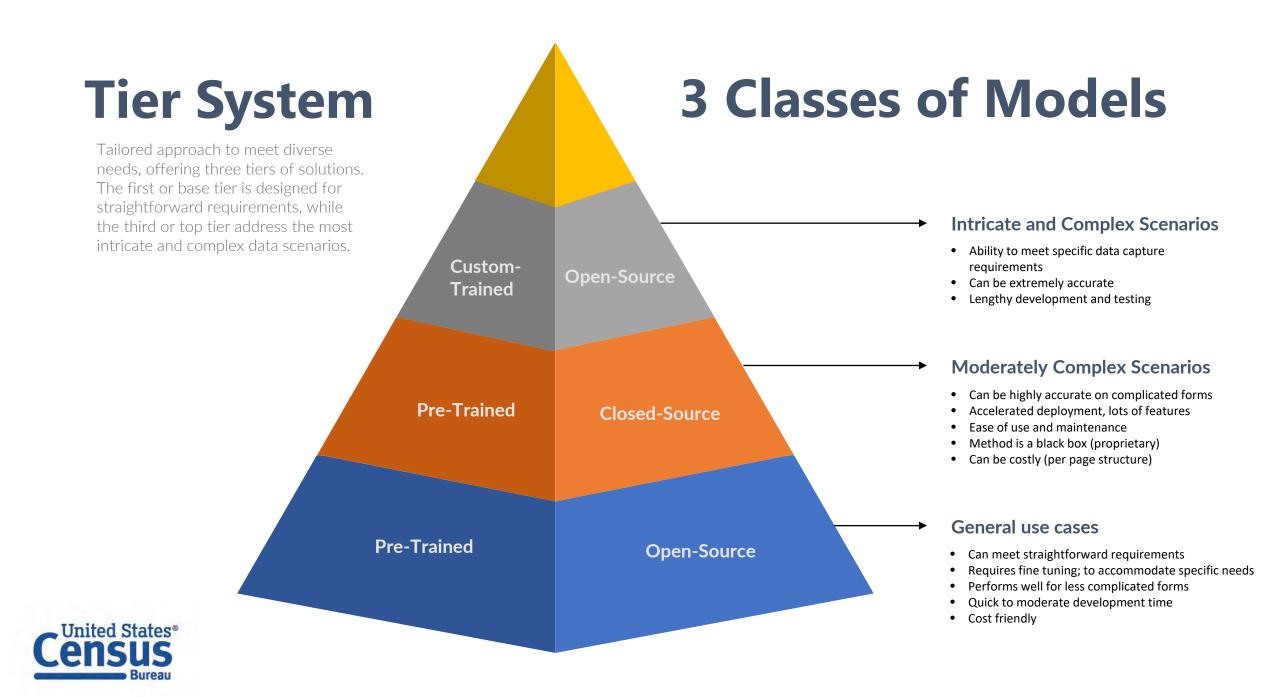
Production keying from image capabilities





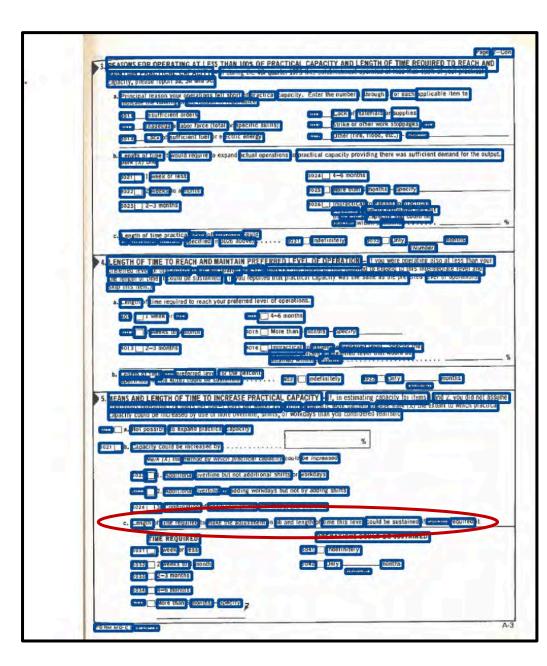






Open Source Pre-Trained (EasyOCR)

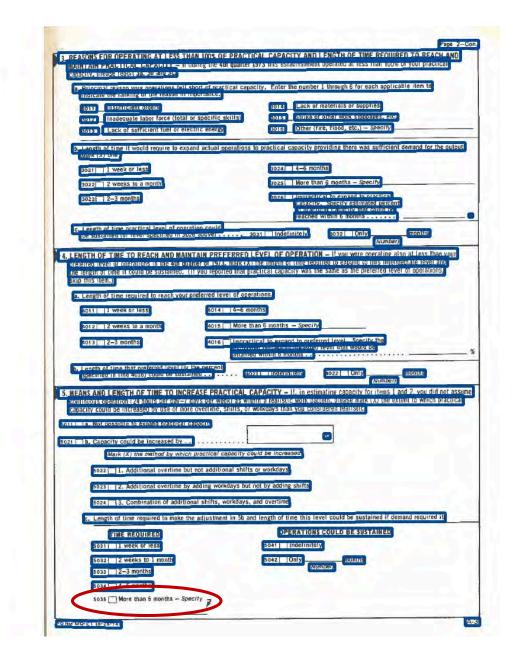
- Flexible
- Requires fine tuning
- Can accommodate specific needs
- Can be highly accurate on complicated forms
 - Segmented text when using "out-of-box"





Open Source Pre-Trained (PaddleOCR)

- Flexible
- Requires fine tuning
- Can accommodate specific needs
- Can be highly accurate on complicated forms
 - But can miss some information when using "out-of-box"





Closed Source Pre-Trained (Textract)

- Can be highly accurate on complicated forms
- Accelerated deployment, lots of features
- Ease of use and maintenance
- Method is a black box (proprietary)
- Can be costly (per page structure)

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Custom-Trained OCR Model (DCDL)

	PERSON 1	PERSON 2		
Please fill one column 🔶	Lastmanne	T and more		
for each person listed in Question 1a on page 1.	First name Middle mitial	Fist name Middle		
 How is this person related to PERSON 1? Fill ONE circle for each person. If Other relative of person in column 1, fill circle and print exact relationship, such as mother-in-law, grandparent, son-in-law, 	START in this column with the household member (or one of the members) in whose name the home is owned, being bought, or rented. If there is no such person, start in this column with	If a RELATIVE of Person 1: O Husband/wife C Brother/sister O Natural-born C Father/mother or adopted C Grandchild son/daughter C Other relative Stepson/		
nièce, cousin, and so on.	any adult household member.	If NOT RELATED to Person 1:		
		○ Roomer, boarder, ○ Unmarried or foster child partner		
		 Housemate, O Other nonrelative 		
3. Sex Fill ONE circle for each person.	C Male O Female	⊖ Male ⊃ Fernale		
4. Race FII ONE circle for the race that the person considers himself/herself to be. If Indian (Amer.), print the name of the enrolled or principal rise	White Black or Negro Indian (Amer.) (Print the name of the enrolled or principal tribe.)	White Black or Negro Indian (Amer.) (Print the name of the enrolled or principal tribe.)		
	Eskimo Aleut <u>Asian</u> or Pacific Islander (API)	 Eskimo Aleut Asian or Pacific Islander (API) 		
If Other Asian or Pacific Islander (API), print one group, for example: Hmong, Pijan, Laotian, Thei, Tongan, Pakistani, Cambodian, and so on.	 Chinese Japanese Filipino Hawaiian Samoan Korean Guamanian Vietnamese Other API 	 Chinese Gitpino Hawaiian Korean Guamanian Vietnamese Other API 		
If Other race, print race.	C Other race (Print race)	Other race (Print race)		

 1990 Mean Exact Word Match Rate (N = 9,700)

 Name
 Mean Match Rate (SE)

 First
 0.91 (0.28)

 Last
 0.89 (0.32)

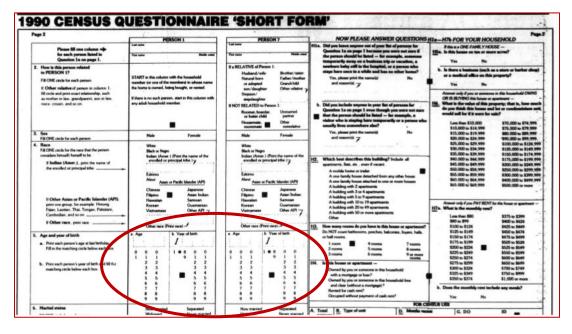
 Middle
 0.88 (0.33)

 Suffix
 0.94 (0.24)

All results were approved for release by the U.S. Census Bureau, Data Management System number: DMS P-7532197 and approval number CBDRB-FY24-ERD006-001.



Custom-Trained OMR Model (DCDL)



OMR Accuracy

	OMR Marked Type 1 [*]	OMR Marked Type 2 [*]
Sample Size	541,000	533,000
Sample Pct	2.83%	0.15%
Percent Correct	98.66%	99.52%
Margin of Error	0.04%	0.02%
Lower Cl	98.83%	99.50%
Upper Cl	98.90%	99.55%

* Type 1 refers to empty bubbles and Type 2 refers to bubbles with numbers in it.

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Digitization and Capture as a Service (DCaaS)

"Making Non-Digital, Digtial"

Securely transforming physical records into digital data, ensuring compliance with federal regulations, and enabling efficient use of valuable information.

Facilitating the Transition to Electronic Records for Federal Agencies



Decennial Census Digitization and Linkage (DCDL)

Methodology to digitize and capture microdata files from the 1960 – 1990 decennial census



OMB & NARA Memorandums

M-19-21 and M-23-07 specifying the federal transition to electronic records



DCaaS Digitization

Converting physical analog records (paper, microfilm, and microfiche) to digital records using federal digitization infrastructure capabilities



DCaaS Capture

Pre-trained and custom solutions to provide digital image data capture with a tiered and tailored approach to meet diverse needs



The Census Bureau DCaaS Team

Thank you for attending our presentation. Please feel free to reach out to the DCaaS team, we are happy to meet, to discuss digitization & capture challenges and solutions including your agency's electronic records, digitization and capture experience.

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