## Better Together: Extending Nestor with Technical Documentation

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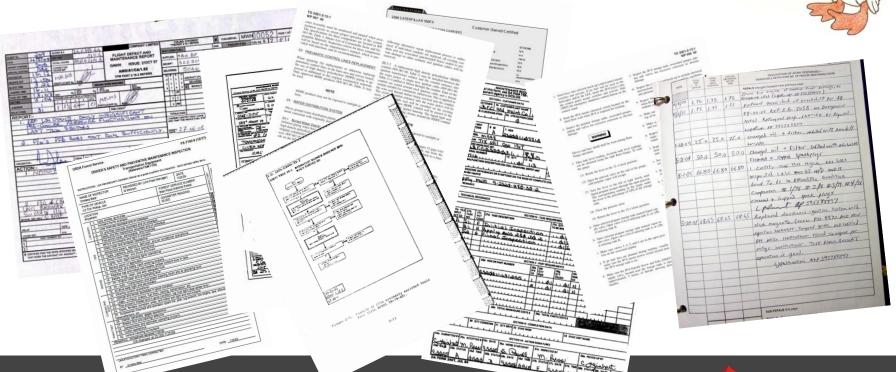


#### Our journey to TLP

- Started with SBIR with USAF for processing unstructured technical orders into structured form
- Goals:
  - Accelerate troubleshooting
  - o Improve mission-capable rates
  - Enable **predictive maintenance**
  - Extract structured information to integrate with databases
- Realized linking with MWO notes would be a separate challenge
  - Enter: Mike and Thurston



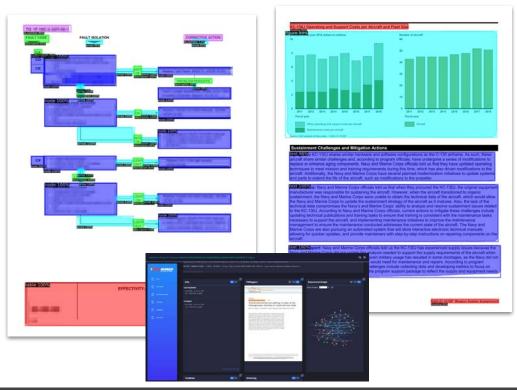
## RedShred and the Ugly Doc-lings





#### **RedShred: Your Documents as a Database**

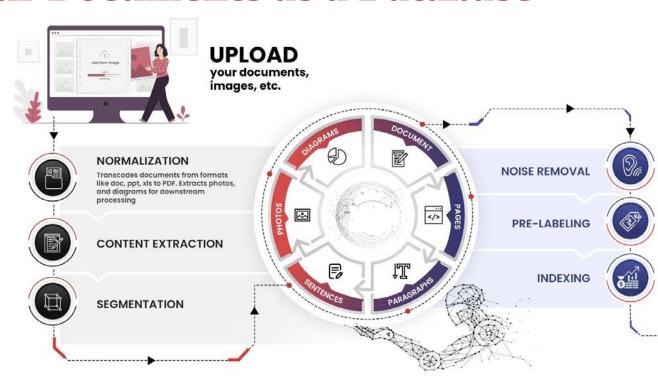
- API-first platform
  - Hybrid vision and NLP extraction and segmentation
    - Text, pictures, diagrams, tables
  - Full-text and enrichment metadata search
  - Easy to integrate into downstream applications
- Collaboration
  - Collection dashboard and feedback
    APIs





#### RedShred: Your Documents as a Database

- Configurable segmentation, extraction and enrichment
- Enrichments allow you to extract tailored metadata for your content (NLP, embeddings, figure analysis, etc.)
- Supports proprietary, open source, and third-party API enrichments
- Centralized resource to collaborate and maximize the value you get from your documents





#### RedShred + NIST in 2020

- RedShred provides programmatic access to technical documentation ...
- Nestor provides rapid tagging and annotation for MWOs ...
- 2020 NIST SBIR Extended Nestor Tagging
  - The goal is to extend what Nestor does and tie it to large documents in RedShred
    - **MWOs + Technical Documentation**





#### **Extending Nestor**

- 1. Pluggable metrics
- 2. Concurrency
- 3. Custom Tags and Custom Classes
- 4. Integrated scoring feedback
- 5. Continuous on-the-fly deployment of tag models as an API
- 6. Integrated comparative visualizations



### 1. Pluggable Metrics

- Similarity
  - Edit-distance
  - Embeddings

- Ranking
  - o TF-IDF
  - Weighting from business value columns

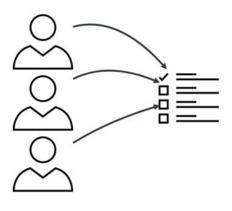
**Embeddings from content** fuel similarity and **tags** from Nestor become training data

On-the-fly swapping to maximize coverage of synonyms

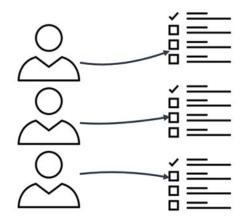


## 2. Concurrency

Shared tag model



Independent tag models



#### 3. Custom Tags and Custom Classes

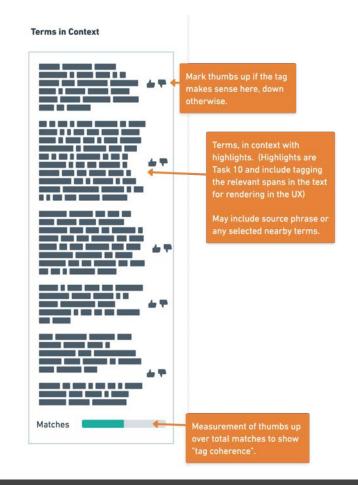
- Arbitrary tags
- Item/Problem/Solution classification
- Ambiguous/Irrelevant classification

- Arbitrary tags
- User-defined multi-class attributes
  - Item/Problem/Solution classification
  - Ambiguous
  - Irrelevant
  - Department
  - o Team
  - External link (database, catalog, etc.)



# 4. Integrated Scoring Feedback

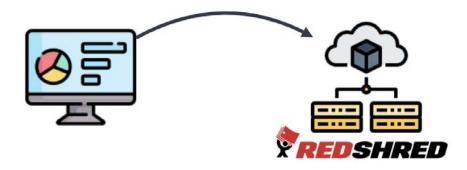
- Allow users to thumbs up/down individual examples in context
- Measures performance of tag application
  - Recorded as ground truth
- From tags towards training data for named-entity recognition (NER) models
  - Facilitates links from MWOs to technical documentation





#### 5. Continuous on-the-fly deployment

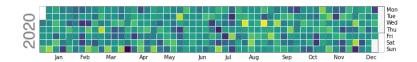
- Continuous on-the-fly deployment of a tag model as an API
  - o ... and as an enrichment inside of your RedShred collection
  - Low-friction integration into point-of-data entry





#### 6. Integrated Comparative Visualizations

- Small Multiples allow rapid comparison across metadata classes
  - Physical location (building, site)
  - Maintainer-specific tag models
    - Inter-annotator agreement for training and QA purposes







#### **Better Together** 💚

- Extracted knowledge from technical documentation
  - Embeddings, language models
  - Named entities and relationships
  - Text, figures, tables, images

- MWO insights from maintainers over time
  - Lived experience of fielded equipment
  - Personalized to each maintainer
    - ... with immediate, continuous deployment
  - Comparisons across maintainers
    - Collective wisdom across teams large and small



#### **Conclusion**

- Prototype in development, beta in late 2021
- Looking for research collaborators and beta testers hello@redshred.com

## Thank you!

