





# An Open Dataset for Training Multimodal Models on Document and Code Tasks

bigdocs.github.io

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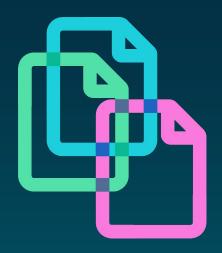








# Multimodal Document Understanding



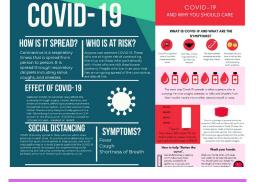


### Why Multimodal Document Understanding?

Existing demand of models to deal with:









Complex Paper Documents

Text-intensive Infographics

Robust Perception & Grounding

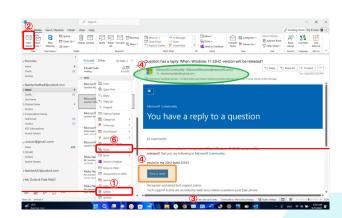


### Why Multimodal Document Understanding?

#### New tasks for Document Al



Multimodal Code Generation



User Interface Understanding

### **Current Limitations:**

- 1. **Models** need **huge** and **diverse** datasets to generalize well.
- 2. **Data is limited**, scattered, poorly licensed, or simplistic.
- Modern/real world tasks are underexplored



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We need **Scalable**, **Open**, and **High-Quality** Multimodal Document Datasets

### **BigDocs Contributions Summary**



BigDocs 7.5M

Large-scale pre-training dataset with clearly licensing and transparent



**BigDocs-Bench** 

10 innovative tasks for multimodal code & GUI **Understanding** 



**BigDocs-Toolkit** 

Crawling, dataset compound management, safety filtering, document AI training



**BigDocs-Models** 

License-permissive multimodal document models



Phi-3 QwenVL2 🔥 LLaVA







### **Dataset Construction**



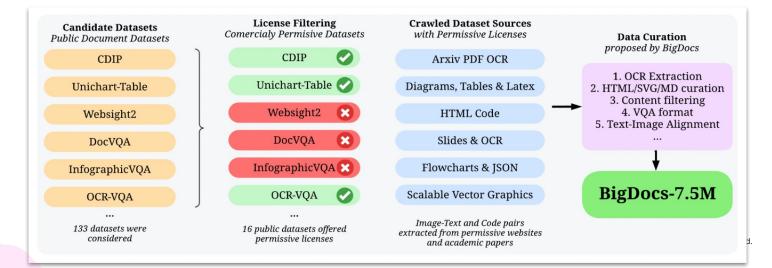
Merged and filtered 130+ datasets → kept only 16 with permissive licenses



Added **new data**: Uls, HTML screenshots, LaTeX tables, ...



Strict content, license, and quality checks throughout





### What's in BigDocs-7.5M?

OCR, Layout, Tables, Forms, Charts, Uls, Scientific Diagrams

Text, Images, Structured Outputs (HTML, LaTeX, JSON, SVG)

Balanced across input-output modalities: vision  $\rightarrow$  code, vision  $\rightarrow$  text

### **BigDocs**

### What's in BigDocs-7.5M?

We curated multimodal datasets in an open and transparent way specifically for training multimodal models document, website, coding domains



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# We created new Benchmarks for Modern Document Al



### Introducing BigDocs-Bench

- Proposing 10 new tasks for challenging real-world use cases
- Tests visual reasoning, layout understanding, structured code generation, UI comprehension

### Multimodal Code Generation

Image2HTML, Image2LaTeX, Image2SVG, Flow2Code

## User Interface Reasoning

GUI2Intent, GUI2Summary, GUI-VQA

# Chart Understanding

Chart2Caption

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### It's not just OCR anymore.

Models must generate complex outputs from visuals.



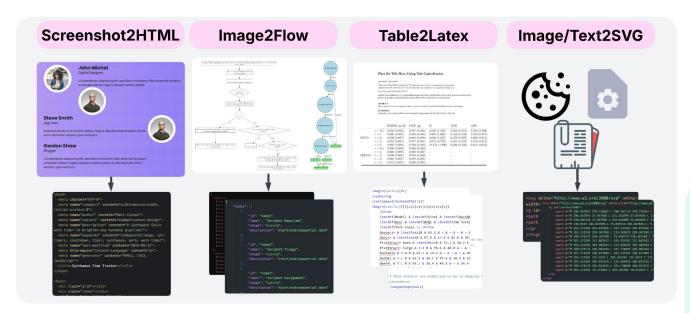


Task	Train	Val	Test	Hidden	Tokens
☐ Screenshot-2HTML	9.3K	1000	500	500	32.7K±53K
■ Table-2LaTeX	77.7K	1000	500	500	438±540
Image2SVG	198K	2000	748	500	2.9K±1.7K
<b>™</b> Image2Flow (GraphViz)	8.0K	1000	500	500	418±124
Image2Flow (JSON)	8000	1000	500	500	1800±601
ப் Chart-2Markdown	4500	1000	500	500	1.6K±4.4K
Chart2Caption	5.4K	1300	650	500	94±49
♣ GUI2UserIntent	79K	1000	500	500	28±4
<b>■</b> GUI2Summary	79K	1000	500	500	132±25
<b>3</b> GUI-VQA	78.9k	1000	500	500	35±24





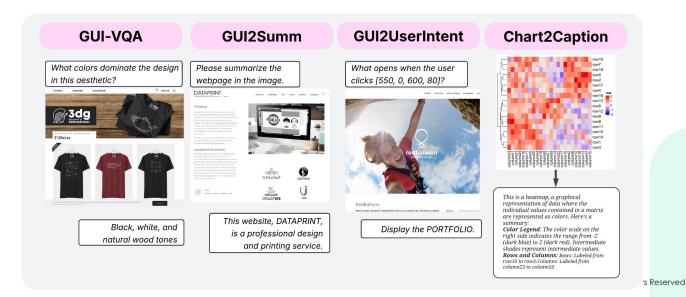
- Input: Screenshot of web page, table, workflow, logotype
- Output: HTML / LaTeX / SVG
- Requires: understanding layout, content, and generating structured code



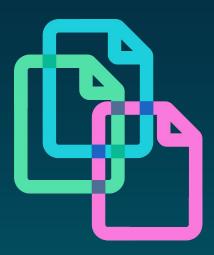
### **Novel Tasks: GUI & Chart Understanding**



- Answer questions & describe UI screenshots.
- Predict user's action from a UI screenshot
- Interpret data visualizations



# Why use **BigDocs**?





### Training & Models

- We Continually Pre-Trained open-source VLMs to perform **Document Al**
- We instruction-tuned the models for multiple downstream tasks
- We released full **training/inference** pipelines and recipes









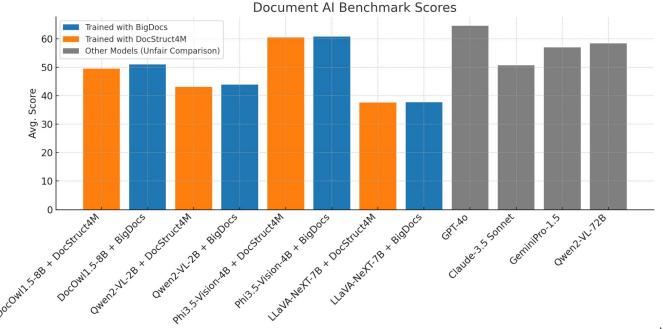






### Results on Document AI Benchmarks

- Pretraining on BigDocs surpasses other pre-training approaches
  - No benchmark contamination, transparent, license clarity
- Our best model matches/outperforms SOTA closed models





### Results on BigDocs-Bench

LLaVA-NeXT-7B

Idefics2-8B

Models struggle at Multimodal Coding and GUI Reasoning BigDocs teaches new skills, surpassing SOTA models

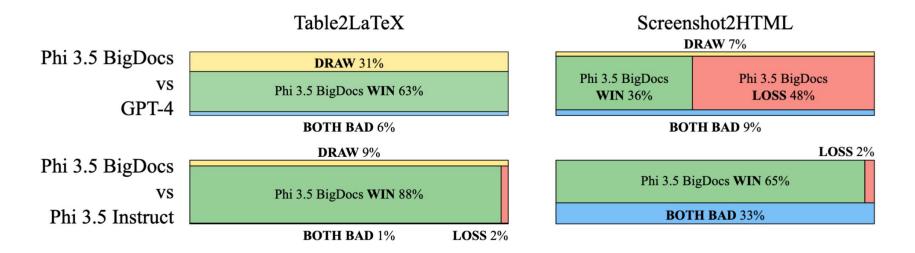
#### Model Performance Comparison on BigDocs-Bench Average Scores for GUI, Chart, and Image Flow Scores for Image-Related Benchmarks 70 80 60 50 60 Score 30 20 20 10 Chart Image Flow GUI Image2SVG Screenshot2HTML Table2Latex Benchmark Benchmark Open Source Closed Source **BigDocs Models** DocOwl-1.5-8B + BigDocs DocOwl-1.5-8B GPT-40 20240806 Claude-3.5 Sonnet Qwen2-VL-2B + BigDocs Owen2-VL-2B Phi3.5-V-4B GeminiPro-1.5 LLaVA-NeXT-7B+ BigDocs Phi3.5-v-4B + BigDocs

Qwen2-VL-72B

#### **Results - Human Evaluation**



- Human evaluation reveals a clear preference
- BigDocs outperforms GPT4 on Latex and HTML generation



### **Qualitative Example - Latex Generation**



BigDocs achieves a better table conversion than GPT4

#### Input Image

	Discrete dynamics(ACC)				Continuous dynamics( $\sigma$ )		
	SIR	SIS	Threshold	Kirman	Gene	Mutualistic	CML
T+1	0.85	0.86	0.89	0.84	0.598	0.958	0.017
T+2	0.73	0.80	0.84	0.81	0.602	1.086	0.021
T+3	0.81	0.75	0.81	0.82	0.609	1.276	0.024
T+4	0.82	0.74	0.74	0.83	0.724	1.512	0.027
T+5	0.80	0.74	0.72	0.85	0.822	1.601	0.028

#### **Output from GPT40**

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#### **Output from BigDocs**

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### Results – Does BigDocs Help?

BigDocs adapts eneral multimodal models to reach SOTA performance in Document AI.

The Delivers +34.5% gains on code generation and GUI understanding tasks.

**Outperforms GPT-4** on LaTeX generation and intent prediction from GUIs.



### **Summary & Takeaways**

- BigDocs-7.5M: Large open multimodal document dataset
- **BigDocs-Bench**: 10 hard tasks, real-world relevance
- Strong gains even outperform GPT-4 in key areas
- Fully open data, tools, models, benchmarks







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### Thanks! Contact us

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