



From Raw Data to Refined Datasets

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CTO @Visual Layer

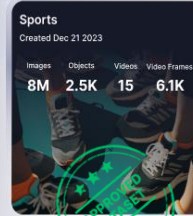


 **1.5TB**
Images

 **2.8TB**
Videos

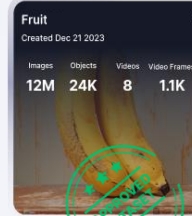
Sports
Created Dec 21 2023

Images	Objects	Videos	Video Frames
8M	2.5K	15	6.1K



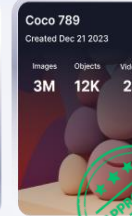
Fruit
Created Dec 21 2023

Images	Objects	Videos	Video Frames
12M	24K	8	1.1K



Coco 789
Created Dec 21 2023

Images	Objects	Videos	Video Frames
3M	12K	2	...



Pixels to Products: My Tech Journey

- Ph.D. on Discrete Optimization Problems (in computer vision)
- Deep Learning since 2012
- Previously CTO & Co founder of **Brodmann17**
- Currently CTO & Co founder of **Visual Layer (fastdup)**

Family Album: 500GB of Chaos (and growing..)

- Married + 2 children + dog
- 500 hours of manually sifting



Generated by DALL·E 3

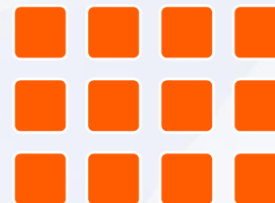
Deja Vu at Work: 100TB of Chaos

- Automotive, tons of data collected on a daily basis
- All this data has to go through a curation process

Raw Data



Dataset



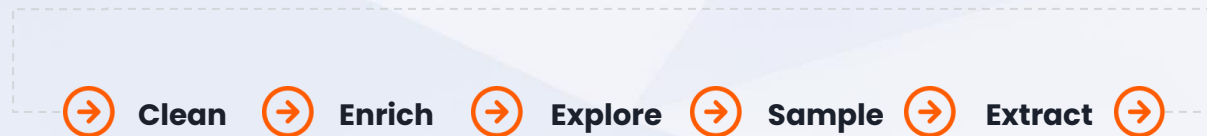
Deja Vu at Work: 100TB of Chaos

- Automotive, tons of data collected on a daily basis
- All this data has to go through a curation process

Raw Data



Dataset Curation Process



Dataset



A man with short brown hair, a beard, and glasses is shown in profile, sitting at a desk and working on a laptop. He is wearing a grey and black patterned sweater. In the background, another person is visible, also working at a desk. The office environment includes a window with blinds, a potted plant, and a small brown bear figurine on the desk. An orange banner is overlaid on the image, containing text and a pointing hand emoji.

Dataset Curation Process today
is mostly: **Done Manually** 📍

The challenges of: Dataset Curation

1



Speed

Slow and Unscalable

2



Cost

Very expensive

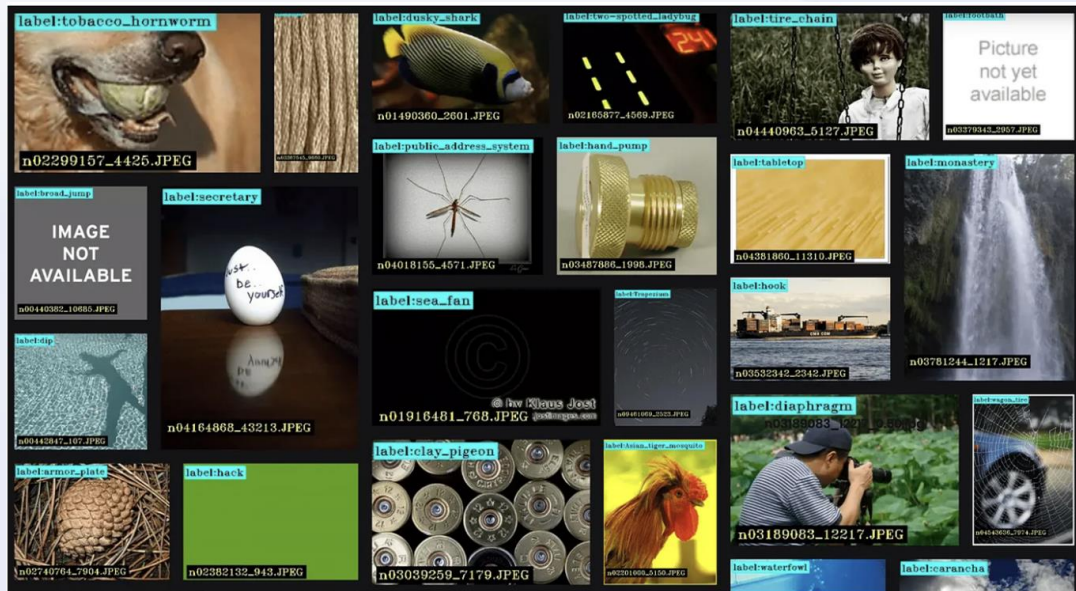
3



Quality

Very poor quality

When Datasets Go Wrong: Bad Labels

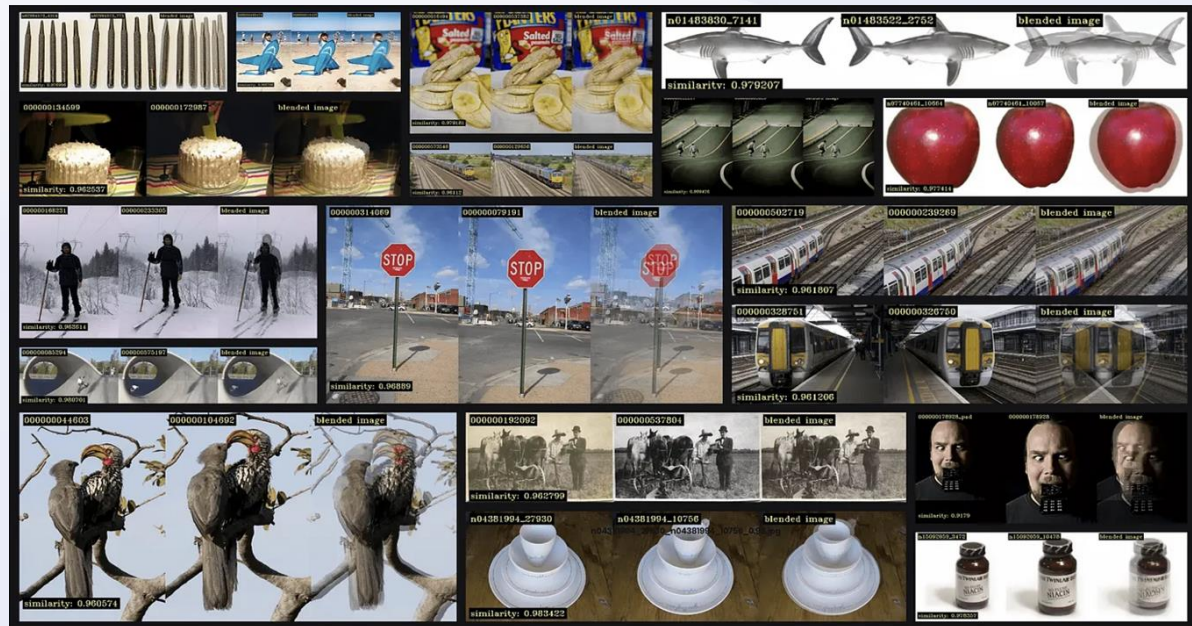


Example wrong labels in the ImageNet-21K dataset. Additional information can be found in our [GitHub repo](#).

Example of many different labels for the same object. There are thousands of such clusters.

 [large-image-datasets-today-are-a-mess](#)

When Datasets Go Wrong: Duplicates



Example near duplicates identified in the MS-COCO (160K images) & ImageNet-21K datasets (11.5M images).
A record breaking number of 1.2M duplicates were identified in the ImageNet-21K dataset! Additional

 [large-image-datasets-today-are-a-mess](#)

fastdup: Efficient Blocks for Dataset Curation

fastdup



1.4K+
GitHub
stars



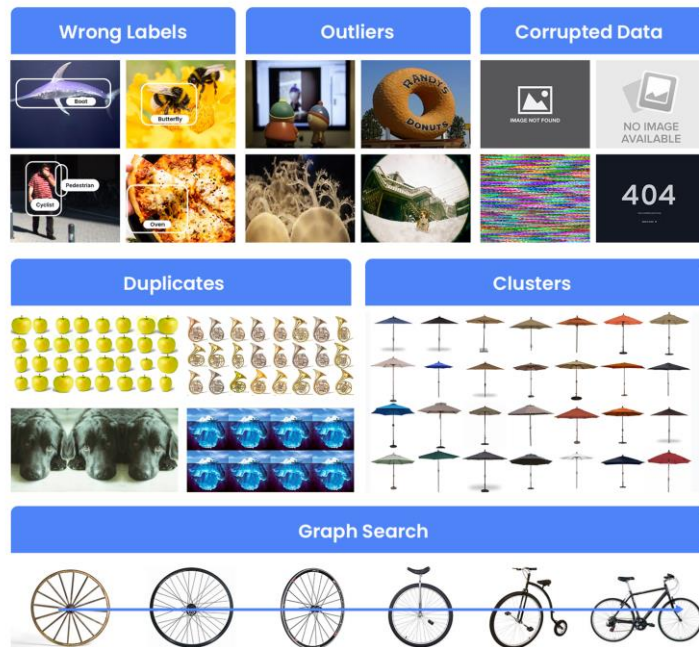
380K+
Downloads



50B+
Images
processed



[visual-layer/fastdup](https://github.com/visual-layer/fastdup)



fastdup: Efficient Blocks for Dataset Curation


In short, you'll need 3 lines of code to run fastdup:

```
import fastdup
fd = fastdup.create(input_dir="IMAGE_FOLDER/")
fd.run()
```

Enrich Data Using Foundation Models


The notebooks in this section show how to enrich your visual dataset using various foundation models supported in fastdup.



 **Zero-Shot Classification:** Enrich your visual data with zero-shot image classification and tagging models such as [Recognize Anything Model](#), [Tag2Text](#), and more.

 [Learn More.](#)



 **Zero-Shot Detection:** Enrich your visual data with zero-shot image detection model such as [Grounding DINO](#) and more.



 [Learn More.](#)



Load Data From Sources



The notebooks in this section show how to load data from various sources and analyze them with fastdup.



  **Hugging Face Datasets:** Load and analyze datasets from [Hugging Face Datasets](#). Perfect if you already have a dataset hosted on Hugging Face hub.

 [Learn More.](#)

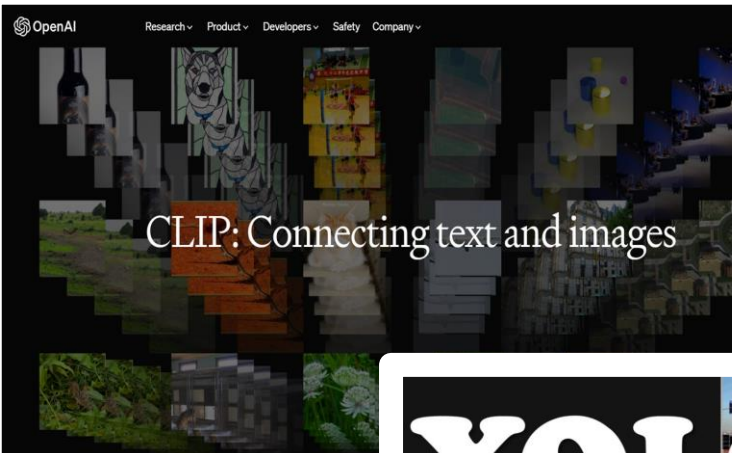
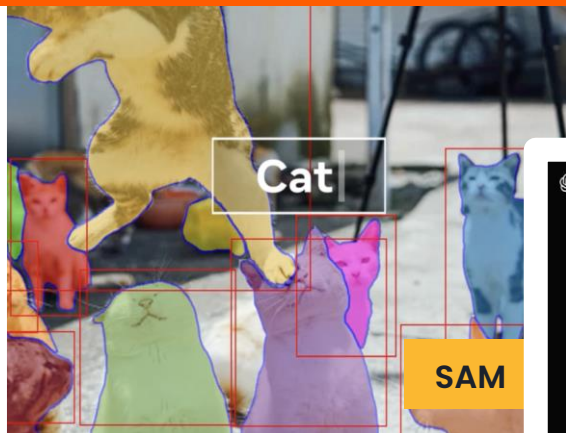


  **Kaggle:** Load and analyze any computer vision datasets from [Kaggle](#). Get ahead of your competition with data insights.

 [Learn More.](#)



Foundation Models: Refocusing AI on Data

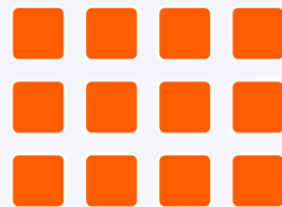


Foundation Models: Refocusing AI on Data

Raw Data



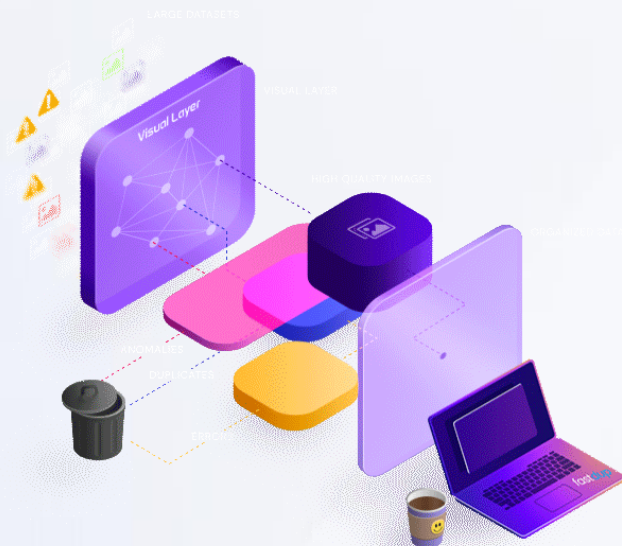
Dataset



**Foundation Model
Fine-tuning**



From fastdup to Visual-Layer



Explore



Enrich



Extract

Explore – Enrich – Extract

Explore: Search and discover relevant data blazingly fast.



Enrich:

Enrich your dataset with state-of-the-art AI models.



Extract: Create meaningful subsets for downstream pipelines.

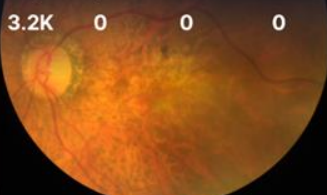


Introducing Public VL-Datasets



retina ⋮
Created Aug 14 2023

Images	Objects	Videos	Video Frames
3.2K	0	0	0




ImageNet21K 100K Issues ⋮
Created Jun 19 2023

Images	Objects	Videos	Video Frames
100K	0	0	0




KITTI ⋮
Created Jul 10 2023

Images	Objects	Videos	Video Frames
15K	12K	0	0




DeepFashion ⋮
Created Jul 10 2023

Images	Objects	Videos	Video Frames
289K	41.3K	0	0




RVL CDIP ⋮
Created Aug 9 2023

Images	Objects	Videos	Video Frames
39.8K	0	0	0




COCO ⋮
Created Jul 13 2023

Images	Objects	Videos	Video Frames
164K	109K	0	0




CelebA ⋮
Created Jul 10 2023

Images	Objects	Videos	Video Frames
203K	0	0	0




Oxford-IIIT Pet ⋮
Created Jul 10 2023

Images	Objects	Videos	Video Frames
7.4K	0	0	0




ImageNet-1K ⋮
Created Jun 21 2023

Images	Objects	Videos	Video Frames
1.3M	0	0	0



Food-101 ⋮
Created Jul 10 2023

Images	Objects	Videos	Video Frames
101K	0	0	0



Public VL-Datasets: Coco Mislabeled

The screenshot displays the Visual Layer interface for the Coco dataset. The top navigation bar shows 'Coco' with statistics: Images 164K, Objects 803.4K, Videos 0, Video Frames 0, Size 25GB, and Created 3 Days Ago. The 'Data' section includes a search bar and filters for 'Contact Us', 'Images', 'Objects', 'Labels', 'Issue Type', and 'User Tags'. A grid of 14 clusters is shown, each with a label and a 3x3 image grid. The clusters are: 110.7k Objects (person, car, bottle), 922 Objects (zebra, giraffe), 877 Objects (elephant), 167 Objects (orange, apple), 103 Objects (train), 97 Objects (stop sign), 65 Objects (bus, person), 65 Objects (person, umbrella, motorcycle), 62 Objects (laptop, tv, keyboard), 55 Objects (tv, person), 51 Objects (horse), 44 Objects (bicycle, person), 43 Objects (clock), 31 Objects (airplane), and 29 Objects (sink). The right sidebar features 'Visual Layer Enrichment', 'Quality' filters (Issue Types: 6), and 'Metadata' filters (Labels: 80). The Quality section lists: mislabels (48,157, 6%), blur (10,883, 1%), outliers (7,130, 1%), dark (3,011, 0%), and duplicates (2,140, 0%). The Metadata section lists: person (243,961, 30%), car (39,232, 5%), chair (38,138, 5%), and bottle (21,105, 3%).

Issue Type	Count	Percentage
mislabels	48,157	6%
blur	10,883	1%
outliers	7,130	1%
dark	3,011	0%
duplicates	2,140	0%


Label	Count	Percentage
person	243,961	30%
car	39,232	5%
chair	38,138	5%
bottle	21,105	3%

Public VL-Datasets: Food-101 Outliers & Batman


Food101 Images 101K Objects 0 Videos 0 Video Frames 0 Size 5GB Created 3 Days Ago

Data


Unlock to search Images and Clusters Contact Us Images Objects Labels Issue Type User Tags Clear Filters




16 Images
filet_mignon steak pork_chop




14 Images
baklava fatafel pulled_pork...




14 Images
garlic_bread omelette apple_pie




14 Images
french_onion... macaroni_an... lasagna




12 Images
garlic_bread lasagna hummus




12 Images
lasagna ravioli



11 Images
fatafel carrot_cake spaghetti_bo...



11 Images
club_sandwich hamburger chicken_que...



Visual Layer Enrichment
Contact us to enrich your data with objects, labels, keywords and tags. Contact us

Quality Source

Issue Types (5)

- duplicates 458 (0%)
- blur 145 (0%)
- outliers 79 (0%)
- dark 43 (0%)
- mislabels 18 (0%)

User Tags User

Currently no User Tags available in this cluster

Metadata Source

Labels (101)

- apple_pie 1,000 (1%)
- baby_bac... 1,000 (1%)
- baklava 1,000 (1%)
- beef_car... 1,000 (1%)
- beef_tart... 1,000 (1%)

1 - 50 of 89,016 Clusters Page: 1 Granularity

Public VL-Datasets: Imagenet 1K semantic search

The screenshot displays the 'ImageNet 1K Enriched' interface. At the top, it shows 'Images 1.3M', 'Objects 0', 'Videos 0', 'Video Frames 0', 'Size 143GB', and 'Created 3 Days Ago'. A search bar is present with the text 'Search by text'. Below the search bar are filters for 'Images', 'Objects', 'Labels', 'Issue Type', and 'User Tags'. The main area is a grid of 15 image thumbnails, each representing a different category. A mouse cursor is pointing at the top-left thumbnail. The right sidebar contains 'VL Enrichment' statistics:

- Keywords (0): Currently no matching keywords.
- Quality: Source
- Issue Types (6):
 - duplicates: 14,843 (1%)
 - mislabels: 14,789 (1%)
 - dark: 3,174 (0%)
 - blur: 2,304 (0%)
 - outliers: 1,172 (0%)
- User Tags: User
 - User Tags (1):
 - funny face: 5,752 (0%)
- Metadata: Source
 - Labels (998):
 - mailot: 2,700 (0%)
 - crane: 2,700 (0%)
 - tiger_bee...: 1,350 (0%)
 - plane: 1,350 (0%)
 - nannha: 1,350 (0%)

Download Quality Issues [Here](#)

VL Dataset Card	Original Dataset	Explore	Issues CSV	Hugging Face Dataset
vl-imagenet-21k	ImageNet-21K	VL PROFILER EXPLORE	DOWNLOAD	👤 DATASET WIP
vl-imagenet-1k	ImageNet-1K	VL PROFILER EXPLORE	DOWNLOAD	👤 DATASET CLICK HERE
vl-laion-1b	LAION-1B	VL PROFILER EXPLORE	DOWNLOAD	👤 DATASET WIP
vl-kitti	KITTI	VL PROFILER EXPLORE	DOWNLOAD	👤 DATASET WIP
vl-coco	COCO	VL PROFILER EXPLORE	DOWNLOAD	👤 DATASET WIP
vl-deepfashion	DeepFashion	VL PROFILER EXPLORE	DOWNLOAD	👤 DATASET WIP
vl-celeba-hq	CelebA-HQ	VL PROFILER EXPLORE	DOWNLOAD	👤 DATASET CLICK HERE
vl-places365	Places365	VL PROFILER EXPLORE	DOWNLOAD	👤 DATASET WIP
vl-food-101	Food-101	VL PROFILER EXPLORE	DOWNLOAD	👤 DATASET CLICK HERE
vl-oxford-iiit-pet	Oxford-IIIT Pet	VL PROFILER EXPLORE	DOWNLOAD	👤 DATASET CLICK HERE

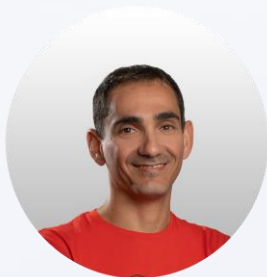
Our Team



Dr. Danny Bickson

Co-founder & CEO

Co-founder and VP EMEA of Turi (acquired by Apple). CMU Researcher. Sr. Mgr at Apple.



Dr. Amir Alush

Co-founder & CTO

Co-founder and CTO of Brodmann17. Highly experienced in building CV/AI Groups and leading into production.



Prof. Carlos Guestrin

Co-founder & CSO

Stanford Prof, Co-founder and CEO of Turi (acquired by Apple). Sr. Dir. at Apple. Deep Learning Infra Team Pioneer.

Our Team



Liah Romantsev

Technical Customer support



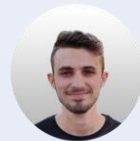
Sinai Yoktan

Sr. Backend Engineer



Gal Bar Nissan

Staff Engineer



Tom Shani

Machine Learning Engineer



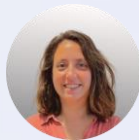
Dima Frid

VP Of Engineering



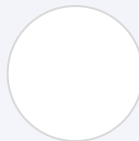
Elad Yaakov

Director of Product



Daniella Bromkish

Sr. Frontend Engineer



Head of AI

WE ARE HIRING!



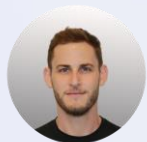
Noa Avidar

Backend Engineer



Gagandeep Gambhir

Sr. FrontEnd Engineer



Guy Singer

Machine Learning Engineer



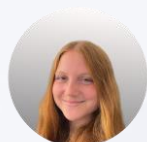
Achiya Jerbi

Machine Learning Engineer



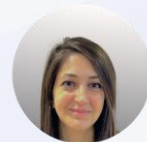
Eli Heifetz

Principal Engineer



Ofri Assif

Office Manager



Etti Leibovitz

Head of Product



Nimrod Mozes

Design Lead

Backed By





Visual Layer



Thank you



Start exploring today