

# **Breaking News**with Data Pipelines

How Airflow and Al Power Investigative Journalism



Zdravko Hvarlingov & Ivan Nikolov

~<del>370 000</del> ~**300 000** 



### What kind of datasets it has?

#### Almost everything...

- Electric Vehicle usage
- Population Data
- Fruit and Vegetable Prices
- U.S. Chronic Disease Indicators
- Government Contracts
- Financial Statements
- etc...



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## What's the problem?



## What's the problem?

Thousands of **missed** stories...





FINANCIAL TIMES > 3 million paying readers

> 700 journalists

> 3500 articles a month



## The Storyfinding team was created





### Who are we?



**Zdravko Hvarlingov** Senior Data Engineer



**Ivan Nikolov** Senior Software Engineer

Trying to "Find stories that otherwise would not be told!"



### What we do and how we work?



structure messy data, connect datasets, apply ML techniques, build alerts & signals







### What we do and how we work?





### Contents

UK Register of Members'
Financial
Interests

Securities and Exchange
Commission
Filings

USA Spending alerting & notifications

What's next for the team



### Contents

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**UK Register of** 

**Members**'

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**USA Spending** 

alerting &

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04

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the team



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A dataset containing financial interests held by Members of Parliament (MPs).



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#### Bennett, Alison (Mid Sussex)

#### 1. Employment and earnings

Role, work or services: Councillor

Payer: Mid Sussex District Council, Oaklands Rd, Haywards Heath RH16 1SS Additional information: 10% of councillor allowance is donated to the Mid Sussex

Liberal Democrats

(Registered 1 August 2024)

Remuneration: £475 a month Hours: 20 hrs a month estimated (Registered 1 August 2024)

Remuneration: £624.66 a month I was the Deputy Leader of Mid Sussex

District Council until Tuesday 23rd July. From: 4 July 2024. Until: 23 July 2024.

Hours: 60 hrs a month estimated number of hours worked

(Registered 1 August 2024)

### 2. (a) Support linked to an MP but received by a local party organisation or indirectly via a central party organisation

Name of donor: Ian Howard Address of donor: private

Amount of donation or nature and value if donation in kind: £5,000

Donor status: individual (Registered 31 July 2024)

Name of donor: Ian Howard Address of donor: private

Amount of donation or nature and value if donation in kind: £5,000

Donor status: individual (Registered 31 July 2024)

Name of donor: Paul Lucraft Associates Ltd

Address of donor: 114 St Martin's Lane, Covent Garden, London WC2N 4BE

Amount of donation or nature and value if donation in kind: £2,000

Donor status: company, registration 05846438

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#### MP name

Category

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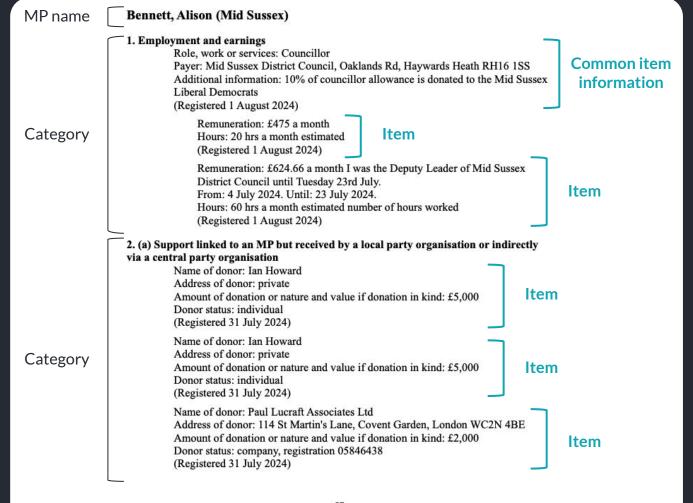
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Key

Category

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Item

FT





### **Entity extraction**

#### 8. Miscellaneous

Member of the Town Fund Board for Ashfield. This is an unpaid role.

Date interest arose: 21 January 2020

Role (Registered 10 February 2020)

Deputy Chairman of the Conservative Party. This part time role would have carried an annual salary of £10,000 from 11 January 2024, but I will not receive any

payment for it.

Date interest arose: 6 February 2023 Amount

Date interest ended: 16 January 2024

(Registered 3 March 2023; updated 15 January 2024 and 17 January 2024)

Name of donor: GB News

My Twitter profile is registered as an affiliated account by GB News. GB News

pays £50 per month for a square affiliate badge on my Twitter page.

Date interest arose: 8 August 2023

(Registered 15 August 2023)

Organisation

### **Fuzzy Matching**

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**Hewlett Pakkard** 



**Hewlett-Packard Corp** 

### Running a ML model within Airflow



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### What is the challenge?

- ML Packages are big which increases task spin up time
- Model snapshots are also quite big
- Additional processing power needed in the Airflow cluster



### Running a ML model within Airflow

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- Additional processing power needed in the Airflow cluster

#### Possible solutions?

- Host the ML model somewhere else and just call it from Airflow
- Install the ML packages for the whole Airflow instance
- Use PythonVirtualenvOperator with cache enabled
- Custom Docker image executed in KubernetesPodOperator



```
FROM python:3.11-bookworm
WORKDIR "/usr/local/job"
COPY requirements.txt .
RUN pip install -r requirements.txt
COPY download_ai_models.py .
RUN python download_ai_models.py
COPY src ./src
COPY app.py .
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```
from gliner import GLiNER
from transformers import pipeline
def load models() -> None:
   GLiNER.from_pretrained('urchade/gliner_medium-v2.1')
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if __name__ == '__main__':
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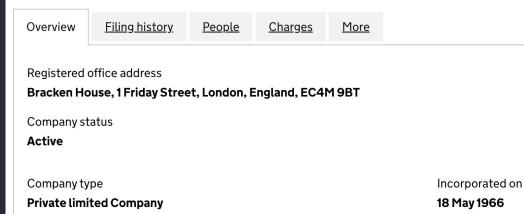


## FINANCIAL TIMES GROUP LIMITED

Company number 00879531

Follow this company

File for this company



#### Accounts

Next accounts made up to **31 December 2024** due by **30 September 2025** 

Last accounts made up to 31 December 2023

#### **Confirmation statement**

Next statement date **5 June 2026** due by **19 June 2026** 

Last statement dated 5 June 2025



## FINANCIAL TIMES GROUP LIMITED

Company number 00879531

Follow this company

File for this company

<u>Overview</u>	Filing history	People	<u>Charges</u>	<u>More</u>				
Officers	Persons with sign	ificant conti	rol					
Filter officers  Current officers  48 officers / 42 resignations								
FORTESCUE, Alison Mary								
Correspondence address  Bracken House, 1 Friday Street, London, England, EC4M 9BT								
Role ACTIV	/E Α	ppointed on						



# How we did it?





## Keir Starmer accepted £76,000 of freebies including tickets to over 20 football games

Commons register of interests shows Labour leader's declarations in last parliament spanned concerts to clothing



in

Share



Labour leader Keir Starmer at the Uefa Euros football final between Italy and England at Wembley Stadium in July 2021 © John Sibley/Getty Images

#### Follow the t

UK general e 2024

UK politics

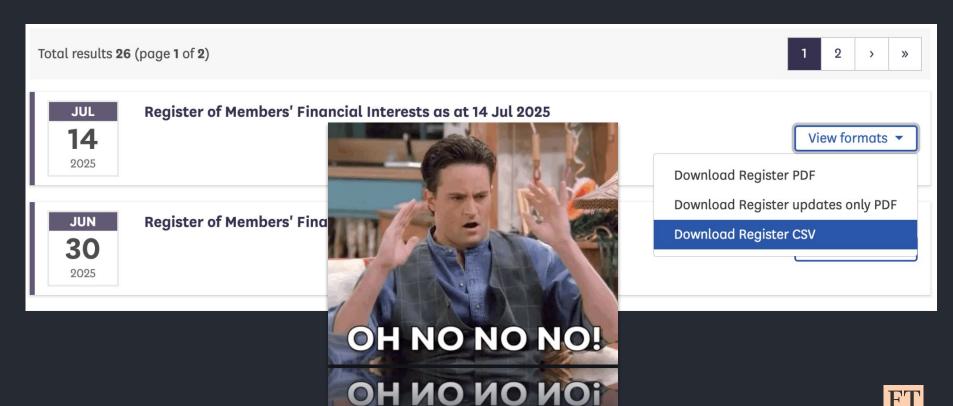
Labour part

Keir Starmer

Anna Gross

# Outcome is stories like this...

# Things change...



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# How we did it?





# How we did it?





#### **UNITED STATES** SECURITIES AND EXCHANGE COMMISSION

Washington, D.C. 20549

#### EODM 10 K

	FORM 10-K	<b>L</b>
Mark One)		_
☑ ANNUAL REPORT PURSUANT TO SECTI	ON 13 OR 15(d) OF	THE SECURITIES EXCHANGE ACT OF 1934
For the fisca	l year ended Septemb	per 28, 2024
	or	
☐ TRANSITION REPORT PURSUANT TO SEC	TION 13 OR 15(d) O	F THE SECURITIES EXCHANGE ACT OF 193
For the transit	tion period from	to
	sion File Number: 00	
Commis	sion rile Number: 00	1-30743
,	<b>É</b> Apple Inc	
(Exact name of	Registrant as specifie	d in its charter)
California		— 94-2404110
(State or other jurisdiction of incorporation or organization)		(I.R.S. Employer Identification No.)
One Apple Park Way		
Cupertino, California		95014
(Address of principal executive offices)		(Zip Code)
(Registrant's te	(408) 996-1010 elephone number, includ	ing area code)
Securities registe	ered pursuant to Section	12(b) of the Act:
Title of south store	Trading	Name of such and an article and the
Title of each class	symbol(s)  AAPL	Name of each exchange on which registered
Common Stock, \$0.00001 par value per share 0.000% Notes due 2025	AAPL	The Nasdaq Stock Market LLC The Nasdaq Stock Market LLC
0.875% Notes due 2025	_	The Nasdaq Stock Market LLC
1.625% Notes due 2026	_	The Nasdaq Stock Market LLC
2.000% Notes due 2027	_	The Nasdaq Stock Market LLC
1.375% Notes due 2029	_	The Nasdaq Stock Market LLC
3.050% Notes due 2029	_	The Nasdaq Stock Market LLC
0.500% Notes due 2031	_	The Nasdaq Stock Market LLC



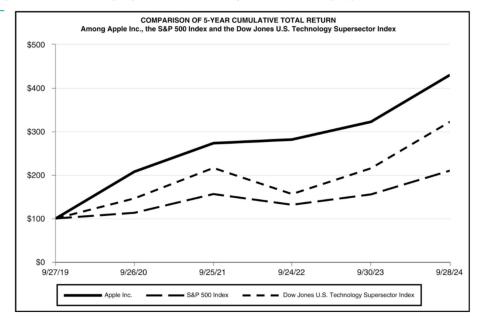
3.600% Notes due 2042

The Nasdaq Stock Market LLC

#### **Company Stock Performance**

#### Text block

The following graph shows a comparison of five-year cumulative total shareholder return, calculated on a dividend-reinvested basis, for the Company, the S&P 500 Index and the Dow Jones U.S. Technology Supersector Index. The graph assumes \$100 was invested in each of the Company's common stock, the S&P 500 Index and the Dow Jones U.S. Technology Supersector Index as of the market close on September 27, 2019. Past stock price performance is not necessarily indicative of future stock price performance.



### Graphics

#### **Tables**

	tember 2019	2020 September September 2021		September 2022		September 2023		September 2024		
Apple Inc.	\$ 100	\$	207	\$ 273	\$	281	\$	322	\$	430
S&P 500 Index	\$ 100	\$	113	\$ 156	\$	131	\$	155	\$	210
Dow Jones U.S. Technology Supersector Index	\$ 100	\$	146	\$ 216	\$	156	\$	215	\$	322

Item 6. [Reserved]

# How we did it?





#### Apple Inc.

#### Form 10-K

#### For the Fiscal Year Ended September 28, 2024

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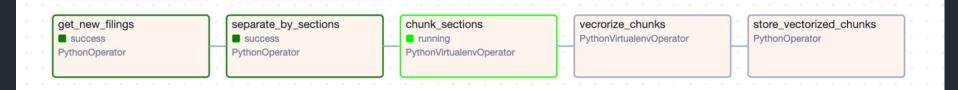


## PDF parsing by section

```
table_of_contents_re = \underline{re}.compile(r'\bTABLE\b\s\b0F\b\s\bCONTENTS\b', \underline{re}.IGNORECASE) index_re = \underline{re}.compile(r'\bINDEX\b', \underline{re}.IGNORECASE) part_re = \underline{re}.compile(r'\bPart\b\s\b([VI]+)\b', \underline{re}.IGNORECASE) # Only roman numerals up to 4 appear item_re = \underline{re}.compile(r'\bItem\b\s\b(\d+)([A-Z])?\b', \underline{re}.IGNORECASE) bold_attr_re = \underline{re}.compile(r'font-weight:(bold|bolder|[789]00)') break_re = \underline{re}.compile(r'(?<=[\.!?])\s+|\n+') # Regex pattern to find sentence or paragraph breaks
```



# How we did it?





## Chunks

Segment of the original text that's been split off to make it manageable for future processing.

- Larger than a sentence.
- Smaller than the whole document
- Size controlled by the embeddings model
- Measured in tokens



Gross	mar	gin	percent	tage
-		-		

37.2 %	36.5 %	36.3 %
73.9 %	70.8 %	71.7 %
46.2 %	44.1 %	43.3 %
	73.9 %	73.9 % 70.8 %

Table block

Text block

#### Section

#### Products Gross Margin

Products gross margin and Products gross margin percentage increased during 2024 compared to 2023 due to cost savings, partially offset by a different Products mix and the weakness in foreign currencies relative to the U.S. dollar.

#### Services Gross Margin

Services gross margin increased during 2024 compared to 2023 due primarily to higher Services net sales.

Services gross margin percentage increased during 2024 compared to 2023 due to a different Services mix.

The Company's future gross margins can be impacted by a variety of factors, as discussed in Part I, Item 1A of this Form 10-K under the heading "Risk Factors." As a result, the Company believes, in general, gross margins will be subject to volatility and downward pressure.

#### Operating Expenses

Operating expenses for 2024, 2023 and 2022 were as follows (dollars in millions):

	2024	Change	2023	Change	2022
Research and development	\$ 31,370	5 %	\$ 29,915	14 %	\$ 26,251
Percentage of total net sales	8 %		8 %		7 %
Selling, general and administrative	\$ 26,097	5 %	\$ 24,932	(1)%	\$ 25,094
Percentage of total net sales	7 %		7 %		6 %
Total operating expenses	\$ 57,467	5 %	\$ 54,847	7 %	\$ 51,345
Percentage of total net sales	15 %		14 %		13 %

Table block

#### Research and Development

The growth in R&D expense during 2024 compared to 2023 was driven primarily by increases in headcount-related expenses.

#### Selling, General and Administrative

Selling, general and administrative expense increased \$1.2 billion during 2024 compared to 2023.

Text block



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Text block



#### Note 2 - Revenue

#### Text block

The Company recognizes revenue at the amount to which it expects to be entitled when control of the products or services is transferred to its customers. Control is generally transferred when the Company has a present right to payment and title and the significant risks and rewards of ownership of products or services are transferred to its customers. For most of the Company's Products net sales, control transfers when products are shipped. For the Company's Services net sales, control transfers over time as services are delivered. Payment for Products and Services net sales is collected within a short period following transfer of control or commencement of delivery of services, as applicable.

The Company records reductions to Products net sales related to future product returns, price protection and other customer incentive programs based on the Company's expectations and historical experience.

For arrangements with multiple performance obligations, which represent promises within an arrangement that are distinct, the Company allocates revenue to all distinct performance obligations based on their relative stand-alone selling prices ("SSPs"). When available, the Company uses observable prices to determine SSPs. When observable prices are not available, SSPs are established that reflect the Company's best estimates of what the selling prices of the performance obligations would be if they were sold regularly on a stand-alone basis. The Company's process for estimating SSPs without observable prices considers multiple factors that may vary depending upon the unique facts and circumstances related to each performance obligation including, where applicable, prices charged by the Company for similar offerings, market trends in the pricing for similar offerings, product-specific business objectives and the estimated cost to provide the performance obligation.

The Company has identified the performance obligations regularly included in arrangements involving the sale of iPhone, Mac and iPad. The first material performance obligation, which represents the substantial portion of the allocated sales price, is the hardware and bundled software delivered at the time of sale. The second material performance obligation is the right to receive certain product-related bundled services, which include iCloud®, Siri® and Maps. The Company allocates revenue and any related discounts to all of its performance obligations based on their relative SSPs. Because the Company lacks observable prices for product-related bundled services, the allocation of revenue is based on the Company's estimated SSPs. Revenue allocated to the delivered hardware and bundled software is recognized when control has transferred to the customer, which generally occurs when the product is shipped. Revenue allocated to product-related bundled services is deferred and recognized on a straight-line basis over the estimated period they are expected to be provided.

For certain long-term service arrangements, the Company has performance obligations for services it has not yet delivered. For these arrangements, the Company does not have a right to bill for the undelivered services. The Company has determined that any unbilled consideration relates entirely to the value of the undelivered services. Accordingly, the Company has not recognized revenue, and does not disclose amounts, related to these undelivered services.

For the sale of third-party products where the Company obtains control of the product before transferring it to the customer, the Company recognizes revenue based on the gross amount billed to customers. The Company considers multiple factors when determining whether it obtains control of third-party products, including evaluating if it can establish the price of the product, retains inventory risk for tangible products or has the responsibility for ensuring acceptability of the product. For third-party applications sold through the App Store, the Company does not obtain control of the product before transferring it to the customer. Therefore, the Company accounts for all third-party application—related sales on a net basis by recognizing in Services net sales only the commission it retains.

## Models

```
@cache
def load_spacy_model() -> spacy.language.Language:
    spacy.cli.download('en_core_web_sm')
    return spacy.load('en_core_web_sm')
@cache
def load_tokenizer() -> Tokenizer:
    return Tokenizer.from_pretrained('Snowflake/snowflake-arctic-embed-s')
@cache
def vectorize_text(text: str) -> list[float]:
    response = requests.post(url='https://api.ft.com/vectoriser/predict', json={'text': text})
    return response.json()['predict']
```

#### Note 2 - Revenue

#### Text block

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The Company has identified the performance obligations regularly included in arrangements involving the sale of iPhone, Mac and iPad. The first material performance obligation, which represents the substantial portion of the allocated sales price, is the hardware and bundled software delivered at the time of sale. The second material performance obligation is the right to receive certain product-related bundled services, which include iCloud®, Siri® and Maps. The Company allocates revenue and any related discounts to all of its performance obligations based on their relative SSPs. Because the Company lacks observable prices for product-related bundled services, the allocation of revenue is based on the Company's estimated SSPs. Revenue allocated to the delivered hardware and bundled software is recognized when control has transferred to the customer, which generally occurs when the product is shipped. Revenue allocated to product-related bundled services is deferred and recognized on a straight-line basis over the estimated period they are expected to be provided.

For certain long-term service arrangements, the Company has performance obligations for services it has not yet delivered. For these arrangements, the Company does not have a right to bill for the undelivered services. The Company has determined that any unbilled consideration relates entirely to the value of the undelivered services. Accordingly, the Company has not recognized revenue, and does not disclose amounts, related to these undelivered services.

For the sale of third-party products where the Company obtains control of the product before transferring it to the customer, the Company recognizes revenue based on the gross amount billed to customers. The Company considers multiple factors when determining whether it obtains control of third-party products, including evaluating if it can establish the price of the product, retains inventory risk for tangible products on has the responsibility for ensuring acceptability of the product. For third-party applications sold through the App Store, the Company does not obtain control of the product before transferring it to the customer. Therefore, the Company accounts for all third-party application—related sales on a net basis by recognizing in Services net sales only the commission it retains.

#### Note 2 - Revenue

#### Text block

The Company recognizes revenue at the amount to which it expects to be entitled when control of the products or services is transferred to its customers. Control is generally transferred when the Company has a present right to payment and title and the significant risks and rewards of ownership of products or services are transferred to its customers. For most of the Company's Products net sales, control transfers when products are shipped. For the Company's Services net sales, control transfers over time as services are delivered. Payment for Products and Services net sales is collected within a short period following transfer of control or commencement of delivery of services, as applicable.

The Company records reductions to Products net sales related to future product returns, price protection and other customer incentive programs based on the Company's expectations and historical experience.

For arrangements with multiple performance obligations, which represent promises within an arrangement that are distinct, the Company allocates revenue to all distinct performance obligations based on their relative stand-alone selling prices ("SSPs"). When available, the Company uses observable prices to determine SSPs. When observable prices are not available, SSPs are established that reflect the Company's best estimates of what the selling prices of the performance obligations would be if they were sold regularly on a stand-alone basis. The Company's process for estimating SSPs without observable prices considers multiple factors that may vary depending upon the unique facts and circumstances related to each performance obligation including, where applicable, prices charged by the Company for similar offerings, market trends in the pricing for similar offerings, product-specific business objectives and the estimated cost to provide the performance obligation.

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## Models

```
@cache
def load_spacy_model() -> spacy.language.Language:
    spacy.cli.download('en_core_web_sm')
    return spacy.load('en_core_web_sm')
@cache
def load_tokenizer() -> Tokenizer:
    return Tokenizer.from_pretrained('Snowflake/snowflake-arctic-embed-s')
@cache
def vectorize_text(text: str) -> list[float]:
    response = requests.post(url='https://api.ft.com/vectoriser/predict', json={'text': text})
    return response.json()['predict']
```

# How we did it?





## Models

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```



## Models

## Local

- Small model
- Quick integration
- Fast inference

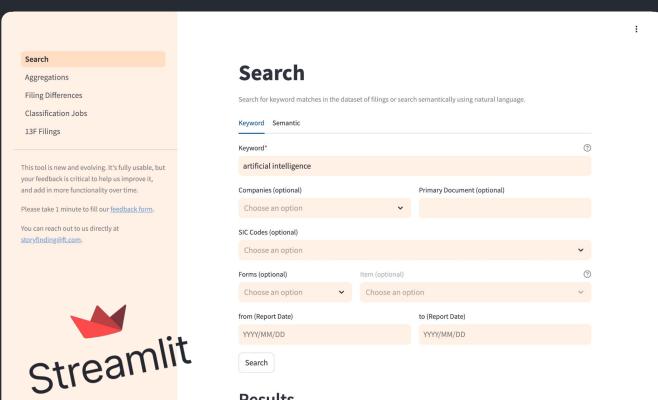
## Hosted

- Dedicated hardware
- Reusable output
- Better resource management



# How we did it?





#### **Results**

# **Backfill pitfalls**

## What is the challenge?

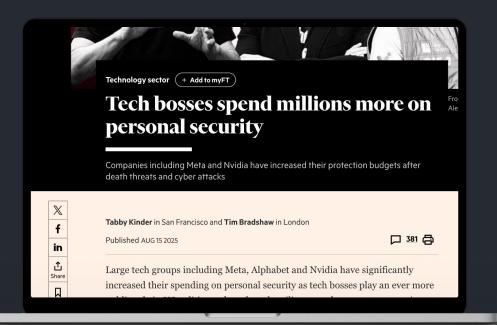
- Only CLI access (Solved in Airflow 3)
- The DAG schedule is used to get the run intervals
- Revenge of the RegEx



## **Backfill solution**

#### **DAG** conf Parameters 2025-01-01 filings\_since: Only the SEC Filings 'filing\_date' >= 'filings\_since' will be downloaded and processed. If not specified, default is `MAX(filing\_date)` for each company for each form type. 2025-06-30 filings\_until: Only the SEC Filings 'filing\_date' <= 'filings\_until' will be downloaded and processed. If not specified or 'filings\_since' param is None, no upper limit is applied. 1 [ "name": "Company Name", "cik": "123456789", "ticker": "TICKER" }, "name": "Company Name 2", "cik": "123456789", companies "ticker": "TICKER2" 10 11 12 If provided, only the companies in the list will be processed. Otherwise, all companies in the config file will be taken into account. Make sure to provide the list of companies in the format: [{"name": "Company Name", "cik": "123456789", "ticker": "TICKER"}, ...].





# Outcome is stories like this...

# Contents

01

**UK Register of** 

Members'

Financial

Interests

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Securities and

Exchange

Commission

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**USA Spending** 

alerting &

notifications

04

What's next for

the team



# **USA Spending**

## What is it?

A structured dataset containing information how U.S. federal funds are allocated and spent across different agencies, recipients, and programs.



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The dataset is extremely large because of the amount of US government contracts and all the transactions related to them.



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### What is the goal?

Implement a tool which notifies you whenever something changes around your companies of interest and gives you an easy access to the data.



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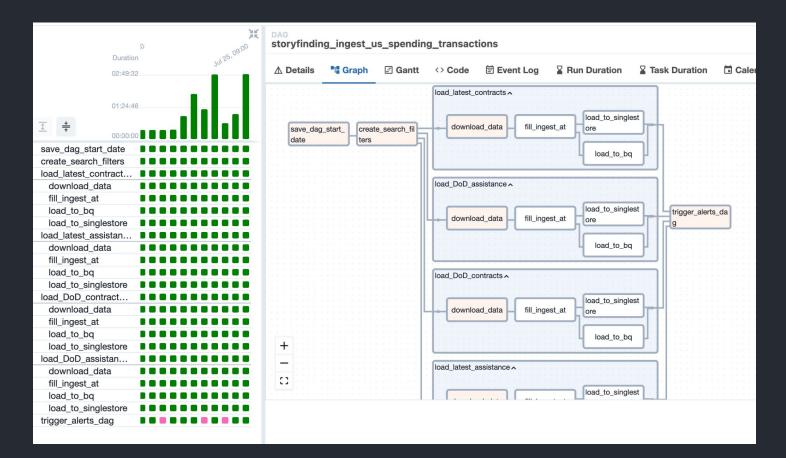
Implement a tool which notifies you whenever something changes around your companies of interest and gives you an easy access to the data.

#### How we did it?

Airflow pipelines running a couple of times a day doing all the magic...



## Data collection pipeline





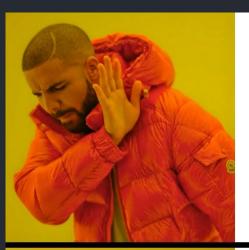
get\_alerts\_config\_per\_reporter
PythonOperator

get\_number\_of\_transactions\_per\_entity
PythonOperator









Persistent store and UI on top for user preferences





1	worksheet	email_list		transactions_since	assistance_action_types	contract	_action_types
2	consultants	ivan.nikolov@ft.com		2025-01-20	All	A,B	
3	musk	zdravko.hvarlingov@ft.com, ivan.nikolov@ft.com		2025-01-20	All	All	
4	gsa_list	zdravko.hvarlingov@ft.com		2025-01-20	All	M,N,P	
5	pharma	zdravko.hvarlingov@ft.com, ivan.nikolov@ft.com		2025-01-20	All	All	
6	global_health	ivan.nikolov@ft.com		2025-01-20		F	
	sap	ivan.nikolov@ft.com		2025-01-20		All	
8	detention	zdravko.hvarlingov@ft.com, ivan.nikolov@ft.com		2014-01-01		D	
9	ice_air		varlingov@ft.com	2020-01-01		С	
10	golden_dome		varlingov@ft.com	2025-07-01	All	All	
11	cloud	ivan.nikolo	ov@ft.com	2025-01-20	All	All	
			A		В		С
		1	Name		Identifier	Ty	ype
		2	SPACE EXPLORATION TECHNOLOGIES CORP.	C6	M7C2FLKER5		Recipient ▼
		3	SPACE EXPLORATION TECHNOLOGIES CORP	H5.	JUPMRB3KX6	Recipient ▼	
		4	SPACE EXPLORATION TECHNOLOGIES CORP.	UW	SJVJQGB2X5		Recipient •
		5	PIONEER AEROSPACE CORP	M8	88MTTQ8GU5		Recipient •
		6	TESLA MOTORS INC	VU	8VCVEXW3L4		Recipient ▼
		7	TESLA, INC.	TB <sup>-</sup>	THGLM2G9D3		Recipient ▼
		8	TESLA MOTORS SINGAPORE PRIVATE LIMITED	VU	EAP5535EJ6		Recipient •

В

**ECHOSTAR CORPORATION** 

10

11

MAXWELL TECHNOLOGIES, INC.

HUGHES NETWORK SYSTEMS LLC

A

С

D

CCS5EN6JVX97

WBVXJHWF2L97

G1PMX8473K14

E

Recipient ▼

Recipient ▼

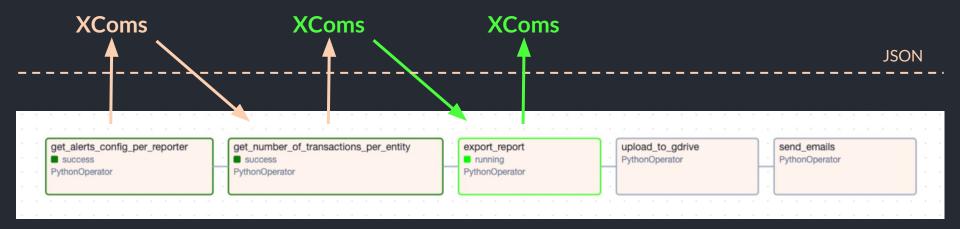
Recipient ▼



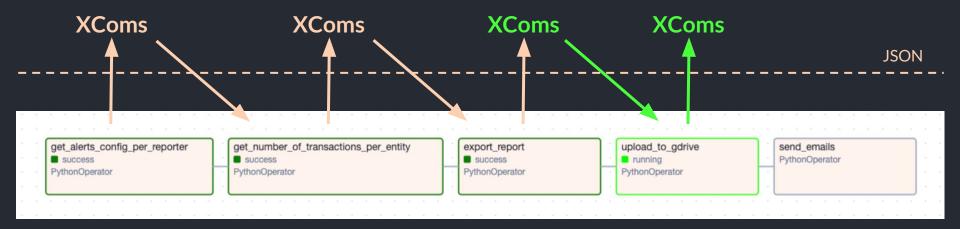




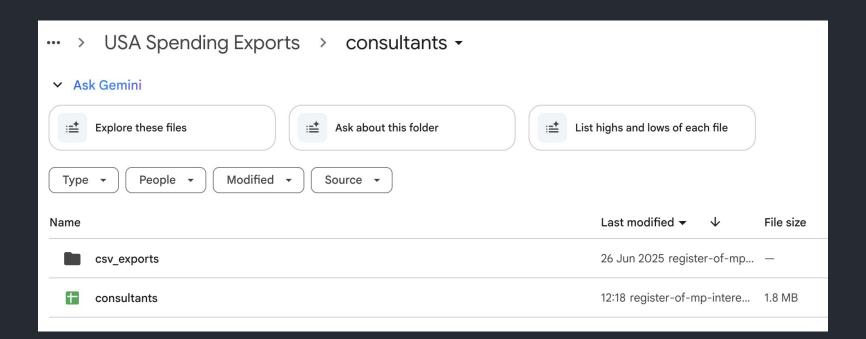


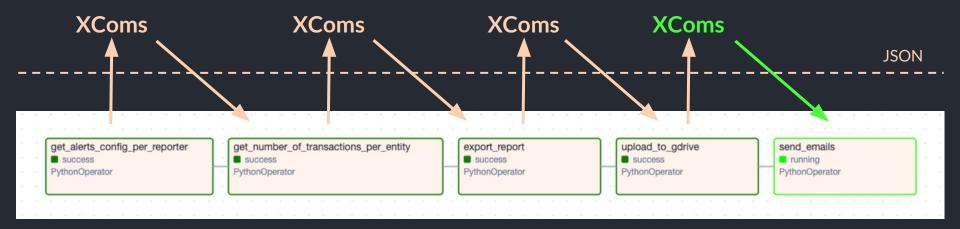














This is an automated **Storyfinding** notification from our **DEV** environment! There is new **USA Spending** data related to your entities of interest in the config **consultants**.

#### Which entities are affected?

Here you can see a summary of the count of new transactions:

- Accenture (recipient):
  - New contracts transactions: 42
  - New assistance transactions: 0
- Booz Allen Hamilton (recipient):
  - New contracts transactions: 99
  - New assistance transactions: 0
- EY / Ernst & Young (recipient):
  - New contracts transactions: 5
  - New assistance transactions: 0
- EY / Ernst & Young (recipient):
  - New contracts transactions: 1
  - New assistance transactions: 0
- Guidehouse (recipient):
  - New contracts transactions: 5
  - New assistance transactions: 0



#### Where can you find the data?

The data is located in two different places:

- Google Spreadsheet file contains as many transactions as possible related to your entities of interest split into a cou
  cells in the file, latest transactions are with the highest priority. Keep in mind that you can increase the number of t
- Google Drive folder a couple of CSV exports containing the latest transactions related to your entities of interest, as

#### What is the data structure and how is it split?

Overall the data is split into four different categories:

- Category: contracts\_latest
   Description: Latest contracts transactions related to your entities of interest.
   Export counts:
  - ∘ ☑ Google Sheets: 181/181 transactions uploaded
- Category: contracts\_all
   Description: All contracts transactions related to your entities of interest since the date you provided in the config.

Export counts:

- Category: assistance\_latest
   Description: Latest assistance transactions related to your entities of interest.
   Export counts: No new transactions found, old exports are up to date and will not be updated.
- Category: assistance\_all
   Description: All assistance transactions related to your entities of interest since the date you provided in the config.

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- · Category: contracts\_all

Description: All contracts transactions related to your entities of interest since the date you provided in the config. Export counts:

- ∘ **CSV Export**: 7375/7375 transactions uploaded
- Category: assistance\_latest

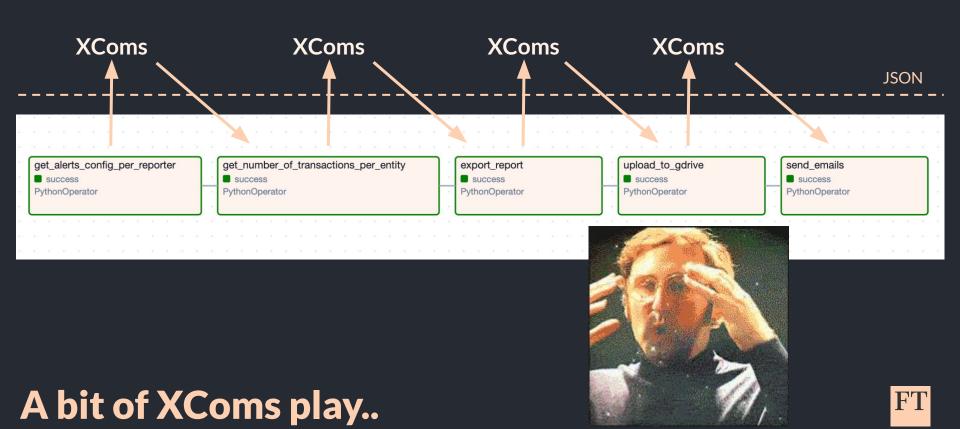
Description: Latest assistance transactions related to your entities of interest.

Export counts: No new transactions found, old exports are up to date and will not be updated.

· Category: assistance all

Description: All assistance transactions related to your entities of interest since the date you provided in the config. Export counts: No new transactions found, old exports are up to date and will not be updated.





## Trump administration to expand blitz against spending on consultants

Firms including Deloitte and Accenture told to justify billions of dollars' worth of contracts









The largest contract affected during the US government's cuts is an umbrella contract covering IT services for the Internal Revenue Service, pictured, led by Deloitte © Bloomberg

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