DUBLIN: Visual Document Understanding By using Language-Image Network



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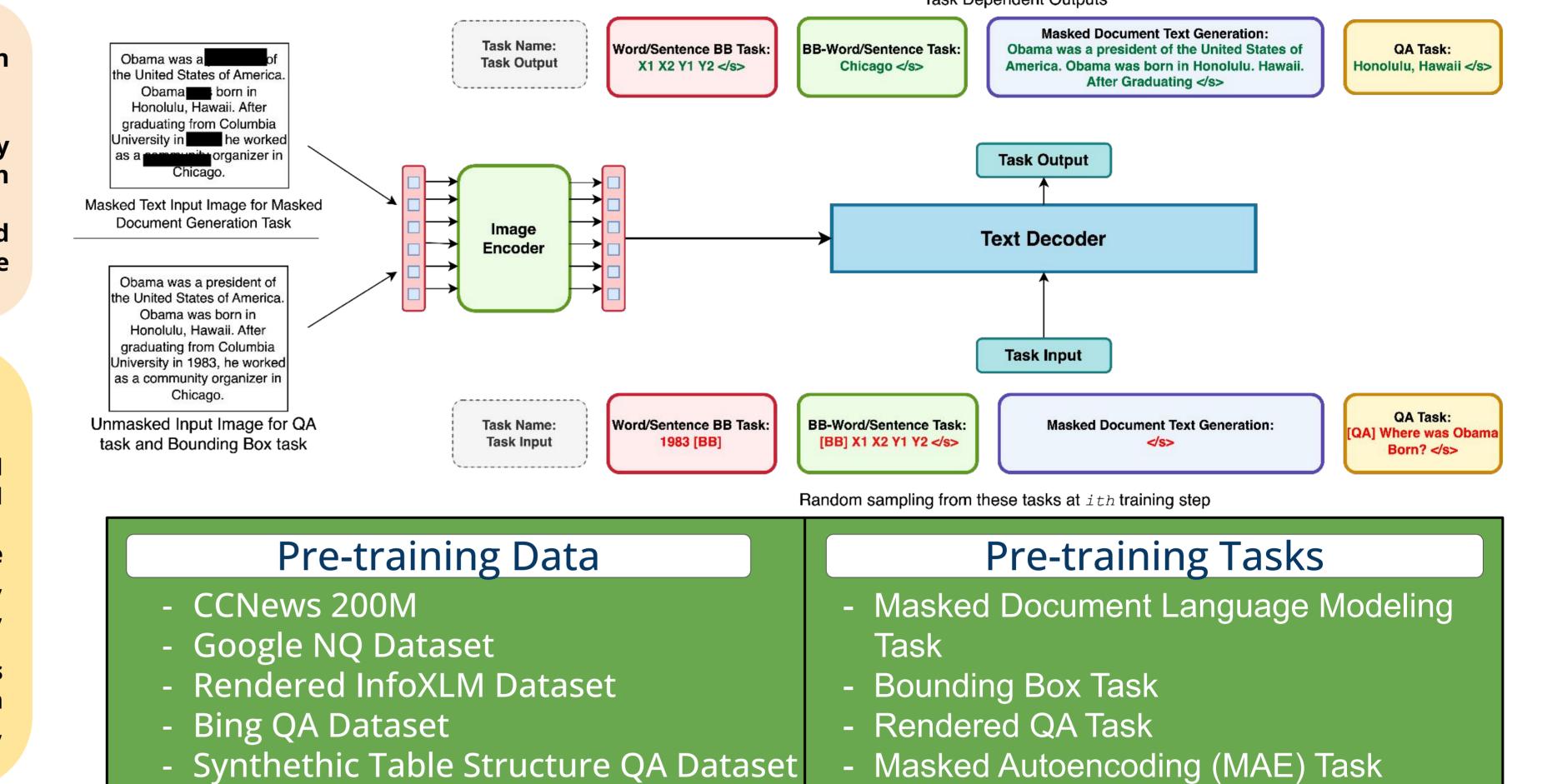


Introduction

IPL 2023 POINTS TABLE TEAM UJARAT TITANS CHENNAI SUPER KINGS +0.652 +0.284 17 UCKNOW SUPER GIANTS 0 -0.044 16 MUMBAI INDIANS RAJASTHAN ROYALS 7 7 0 +0.148 14 ROYAL CHALLENGERS BANGALORE OLKATA KNIGHT RIDERS -0.239 12 PUNJAB KINGS 0 -0.304 12 14 5 9 0 -0.808 10 DELHI CAPITALS

Document Understanding Challenges with Current Approaches:

- Limitations of OCR: Computationally expensive, error-prone, struggles with rich visual cues.
- Pixel-only models (e.g., Donut and **Pix2struct) lack versatility for diverse** tasks.



Pre-training Framework

Task Dependent Outputs



The IPL Points Table is one of the most challenging points tables in cricket as it can declare the team's fate for the qualifications. The tournament will begin with league matches, where each team will face the other twice. Then the top-4 teams will qualify for the knock-out games and then the top-2 will play the final. The IPL Points Table will come in handy at the end of the league stages when teams will look at their wins and losses. If a team wins on a regular basis, then there won't be any issue, but when a team loses their important matches in the group stages then their qualification will be totally based on the net run-rate (NRR). If the NRR is good then a team can qualify for the knockout stage but if the team has moderate or negative NRR, then the team could be in deep trouble. All 10-teams will get 2 points if they win a game. If a team loses, they won't get any points and it might affect their NRR. If the game is tied, then it will be decided by a super-over which would decide the game. The knock-out games and the final would decide the fate of whether there would be a new champion or the defending champion retains the title.

Question 1: What is the Net RR of Royal Challengers Bangalore? Answer: +0.135

Question 2: How is the game decided in case of tie? Answer: It will be decided by a super-over.

Question 3: Which team scores the least points? Answer: Sunrisers Hyderabad

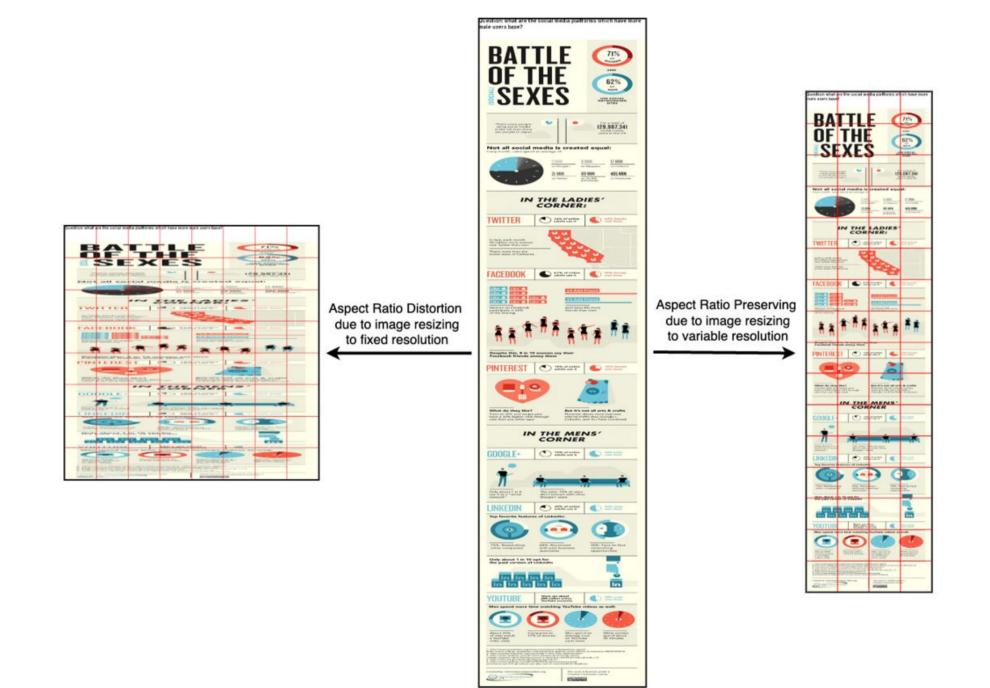
Features of DULIN

- OCR-free Visual Document Model
- Compact in size: it's only 976M parameter leveraging Bletchley-InfoXLM architecture
- Robust and Versatile: Handles diverse document images such as infographics, charts, forms, tables, natural images, webpages, UI, plain-text.
- Achieves SOTA on multiple tasks such as illustrations, information QA over extraction, table QA, UI understanding, image captioning etc.

Data Preprocessing Strategies before Finetuning

MAE Task

Efficient Variable Input Resolution Technique Question on top of image



• Both inputs are pre-processed differently for a target of 64

patches. Suppose the original image is 1000×200 (aspect

ratio=5), we resize it to make the aspect ratio 4, the closest

even power of 2. The image becomes 448×112 for variable

• This technique helps in the preservation of aspect ratio while

• Also, this technique is highly optimized as one batch can have

• Compared to Fixed Resolution, there is an performance

improvement of 17% in InfographicsVQA, 3.2% in DocVQA,6%

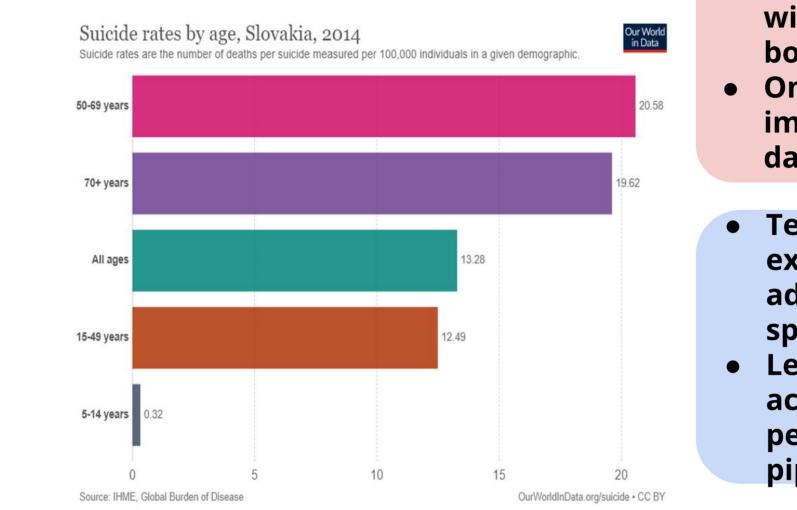
resolution but 224 ×224 for fixed resolution.

multiple images of different aspect ratios.

• It is very helpful to handle long documents.

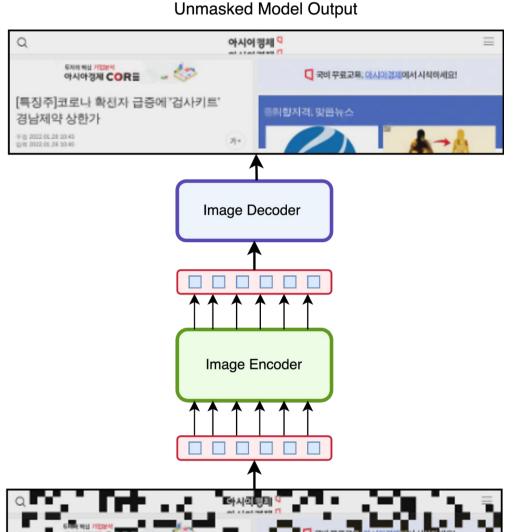
in Deepform with this strategy.

resizing.



Question: Does the difference in the value of All ages and 15-49 years is equal to the value of 5-14 years category?

- Placing question on top of images with different font style and size to boost contextual understanding
- a average, it leads • **On** to improvement by 3% all over datasets.
- Template based finetuning helps in executing diverse tasks without adding any external layers for specific tasks
- Leading to generalisation and

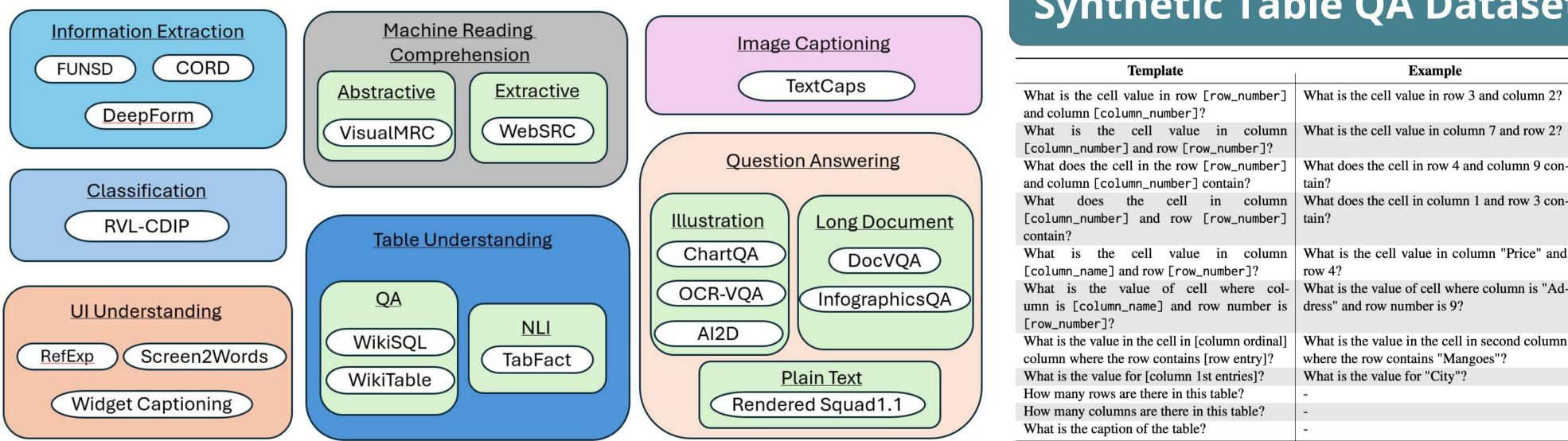


achieving comparable performances to specialized pipeline models.



Masked Input Image

Template based fine tuning



Results and Analysis

Performance on QA over illustrations, UI understanding, image captioning, QA tasks

Model	QA over Illustrations			UI understanding			Captioning	Document QA	
	ChQA	AI2D	O-VQA	RefExp	Widget Cap	Scrn2Wds	TCaps	DVQA	IVQA
Metrics	RA	ANLS	F1	EM	CIDEr	CIDEr	CIDEr	ANLS	ANLS
Donut	41.8	30.8	66.0	-	127.4	56.4	74.4	67.5	11.6
Pix2Struct _{large}	58.6	42.1	71.3	94.2	136.7	109.4	95.5	76.6	40.0
Dublin _{fixed_res}	35.6	51.1	73.1	99.1	132.2	101.8	92.8	78.2	36.8
Dublin _{variable_res}	35.2	52.3	74.0	99.1	132.2	101.8	92.8	80.7	43.0
(SOTA with) spl. pipelines	(VTP)	(DQAN)	(LATr)	(UIB)	(VUT)	(VUT)	(PaLI)	(UDOP)	(UDOP)
	45.5	38.5	67.5	90.8	97.0	64.3	160.4	84.7	47.4

Performance on Table QA/NLI

Model	Table QA/NLI					
	WTQ	TabFact	WikiSQL			
Metrics	EM	Accuracy	EM			
Dublin _{fixed_res} Dublin _{variable_res}	25.7 29.7	73.54 72.9	75.3 75.3			
(SOTA w/) Spl. pipelines	(UDOP) 47.2	(UDOP) 78.9	(TAPEX) 89.2			
(BART) Text Baseline	38.0	76.0	85.8			

Date	[n 1]		Rank	Tournament name	Venue	City	Winner	Runner-up	Score ^[1]	Reference
09-09	09-15	THA	WR	Asian Classic	Riverside Montien Hotel	Bangkok	🕂 Ronnie O'Sullivan	🕂 Brian Morgan	9-8	[2][3]
09-24	09-29	🗙 SCO		Scottish Masters	Civic Centre	Motherwell	Peter Ebdon	🗙 Alan McManus	9-6	[4]
10-05	10-14	🗙 SCO		Benson & Hedges Championship	JP Snooker Centre	Edinburgh	🕂 Brian Morgan	X Drew Henry	9-8	[5]
10-08	10-13	* MLT		Malta Grand Prix	Jerma Palace Hotel	Marsaskala	H Nigel Bond	* Tony Drago	7-3	[6]
10-16	10-27	+ ENG	WR	Grand Prix	Bournemouth International Centre	Bournemouth	Mark Williams	Euan Henderson	9–5	[7]
10-29	11-10	THA		World Cup	Amari Watergate Hotel	Bangkok	Scotland	Ireland	10-7	[8]
11-15	12-01	+ ENG	WR	UK Championship	Guild Hall	Preston	X Stephen Hendry	🔀 John Higgins	10-9	[9]
12-09	12-15	GER	WR	German Open	NAAFI	Osnabrück	🕂 Ronnie O'Sullivan	Alain Robidoux	9-7	[10]
01-02	01-05	+ ENG		Charity Challenge	International Convention Centre	Birmingham	Stephen Hendry	+ Ronnie O'Sullivan	9-8	[11]
01-24	02-01	WAL	WR	Welsh Open	Newport Leisure Centre	Newport	🔀 Stephen Hendry	🕂 Mark King	9-2	[12]
02-02	02-09	+ ENG		Masters	Wembley Conference Centre	London	+ Steve Davis	+ Ronnie O'Sullivan	10-8	[13][14]
02-13	02-22	🗙 SCO	WR	International Open	A.E.C.C.	Aberdeen	🔀 Stephen Hendry	* 📕 Tony Drago	9-1	[15][16]
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Synthetic Table QA Dataset

Example

What is the cell value in row 3 and column 2?

What is the cell value in column 7 and row 2?

What does the cell in row 4 and column 9 con-

What is the cell value in column "Price" and

What is the value of cell where column is "Ad-

What is the value in the cell in second column

where the row contains "Mangoes"?

What is the value for "City"?

02-23	03-02	* MLT	WR	European Open	Conference Centre	Valletta	K John Higgins	🕂 John Parrott	9-5	[17][18]
03-10	03-16	THA	WR	Thailand Open	Century Park Hotel	Bangkok	🕂 Peter Ebdon	🕂 Nigel Bond	9-7	[19][20][21]
03-18	03-23	IRL		Irish Masters	Goff's	Kill	X Stephen Hendry	Darren Morgan	9-8	[22][23]
03-27	04-05	+ ENG	WR	British Open	Plymouth Pavilions	Plymouth	Mark Williams	X Stephen Hendry	9-2	[24]
04-19	05-05	+ ENG	WR	World Snooker Championship	Crucible Theatre	Sheffield	📕 📕 Ken Doherty	🔀 Stephen Hendry	18-12	[25]
05-??	05-??	WAL		Pontins Professional	Pontins	Prestatyn	Hartin Clark	+ Andy Hicks	9-7	[26]
12-28	05-18	+ ENG		European League	Diamond Centre	Irthlingborough	+ Ronnie O'Sullivan	X Stephen Hendry	10-8	[27]

Question: What is the name of the first venue on this list? **DUBLIN's Answer: Riverside Montien Hotel Gold Answer: Riverside Montien Hotel**

Modou Bamba Gaye

From Wikipedia, the free encyclopedia

Modou Bamba Gaye is a Gambian politician who was the National Assembly Member for Lower Saloum, representing the National Reconciliation Party (NRP), from a 2015 by-election to the 2017 parliamentary election.

Political career [edit

Gaye was elected at a 2015 by-election for the seat of Lower Saloum, following the dismissal of incumbent NAM Pa Malick Ceesay from the ruling Alliance for Patriotic Reorientation and Construction (APRC). Gaye defeated APRC candidate Kebba Touray in the election, winning 2764 votes to Touray's 1618 votes.^[1] Speaking in the National Assembly in January 2017, during the constitutional crisis and Yahya Jammeh's refusal to step down, Gaye called for a peaceful transition of power and said, "The people who voted us in are the same people who voted for Jammeh before and are the same people who voted Adama Barrow."[2]

Question: When was Gaye elected for the seat of Lower Saloum? **DUBLIN's Answer: Gaye was elected at a 2015 by-election.** Gold Answer: In 2015

Performance on Information Extraction. Classification and Reading Comprehension

Model	Inform	nation Ext	raction	Classification	Reading Comprehension		
	FUNSD	CORD	DeepForm	RVL-CDIP	WebSRC	VisualMRC	
Metrics	F1	F1	F1	Accuracy	EM/F 1	CIDEr	
Donut Dublin _{fixed_res} Dublin _{variable_res}	- 77.8 77.8	91.6 97.1 97.1	62.2 65.7	95.3 94.9 94.9	- 77.7/84.2 77.7/84.2	- 347.3 347.3	
SOTA with Spl. Pipelines	(LyLMv3) 92.08	(UDOP) 97.6	(UDOP) 85.5	(UDOP) 96.00	(TIE) 81.6/86.2	(LyT5-large) 344.1	
BERT _{large} /T5 (Text Baseline)	65.63	90.25	74.4	89.92	-	-	

• DUBLIN is the first pixel only baseline on FUNSD, Deepform, WebSRC, VisualMRC, WTQ, and TabFact, WikiSQL and Squad1.1.

- We also introduce a new evaluation setup on text-based datasets by rendering them as images.
- It can be used in multiple applications from search engines to presentations.
- Possible future direction: Integrating Generative models like T-NLG or Llama models.

Contact: vchaudhary@microsoft.com

Link to paper: <u>https://arxiv.org/pdf/2305.14218.pdf</u>