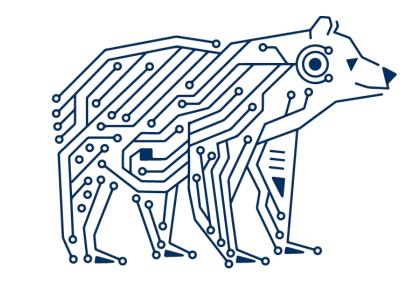


## **Automated Crossword Solving**

Eric Wallace\* Nicholas Tomlin\* Albert Xu\* Kevin Yang\* Eshaan Pathak\* Matthew Ginsberg Dan Klein UC Berkeley

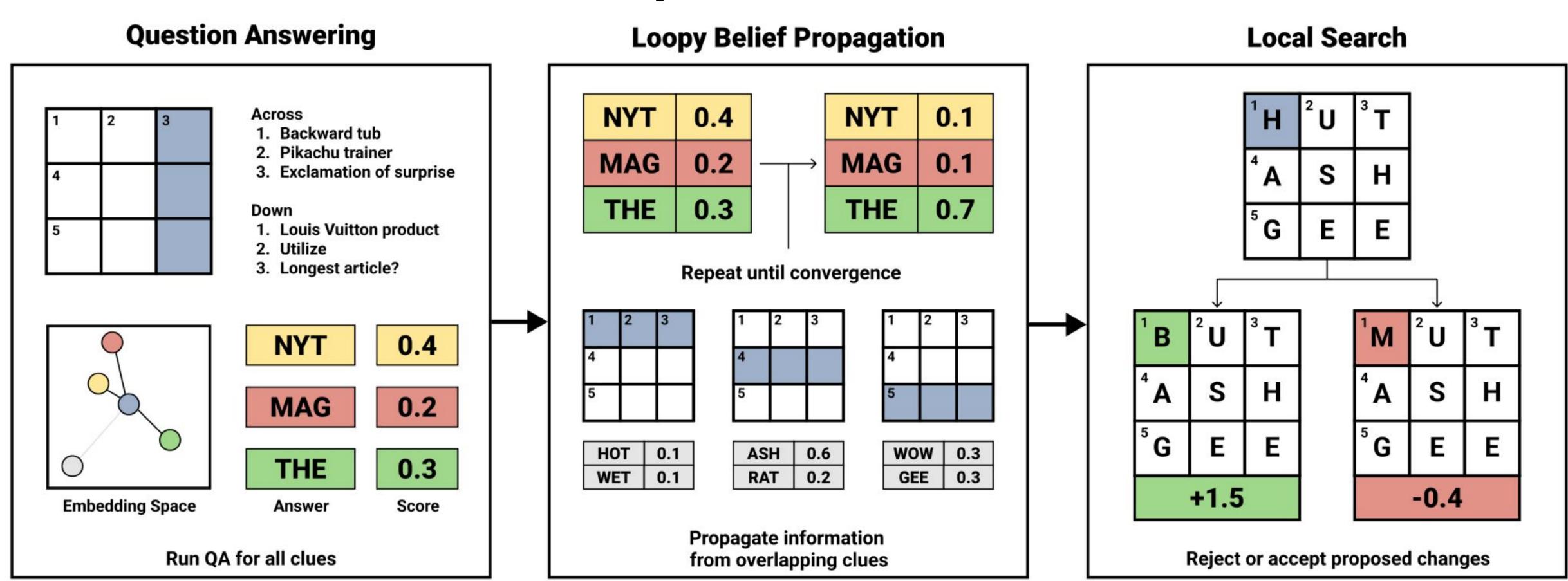


## **Crossword Puzzles and Data**

R	В	G				0	Κ	Α	Р	Ι	S		G	Α	┙	L
Е	Α	R	Р		Ι	Ν	Α	Ν	Е	S	Т		0	Τ	0	Е
Α	U	Е	L		R	Α	U	Ν	С	Н	Υ		W	Α	W	Α
R	Н	Е	Α		Α	R	Α				L	Ι	Е	D	Е	R
М	Α		N	Е			Ι						S			
S	U	S	Т	Α	Ι	N						Ι	Т	S	М	Е
	S	С	Α	Т	S									W	Ι	Е
		R	Ι	Α		K							С	Е		L
			Ν	Т		U						Т	R	Е		
Α	┙	Ш	S		S	Z	Y	Δ	Е	R		Ξ	Α	Т		
				0	I	G	0	0	D		U	0	Р	S	Ш	
			Е			F	כ	R		Σ	Α	R	S	Α	┙	Α
			Z	ш	В	5		Σ	Е	R	Ι	Ν	G	U	Е	S
М	Α	U	Р	R	0				ш	Т	R		Α	S	Α	Р
0	K		Α		S	Т	Α	Т	Ι	0	N		Μ	Α	Z	Е
٧	Ι	Е	S		C	0	L	Α	D	Α	S		Е	G	Α	Ν
Е	N	D	S		Н	0	Т	В	Е	D				Е	R	S

Category	Clue	Answer		
Knowledge (37%)	Birds on Minnesota state quarters Architect Frank	LOONS GEHRY		
Definition (33%)	First in a series Tusked savanna dweller	PILOT WARTHOG		
Commonsense (14%)	Like games decided by buzzer beaters Opposite of <i>luego</i>	CLOSE AHORA		
Wordplay (8%)	Frequent book setting One followed by nothing?	SHELF TEN		
Phrase (8%)	"Is it still a date?"  "Post analysis"	AREWEON HOC		
Cross-Reference (2%)	See Capital of 52-Down Oft-wished-upon sighting	GHANA SHOOTINGMETEOR		

## **System Overview**

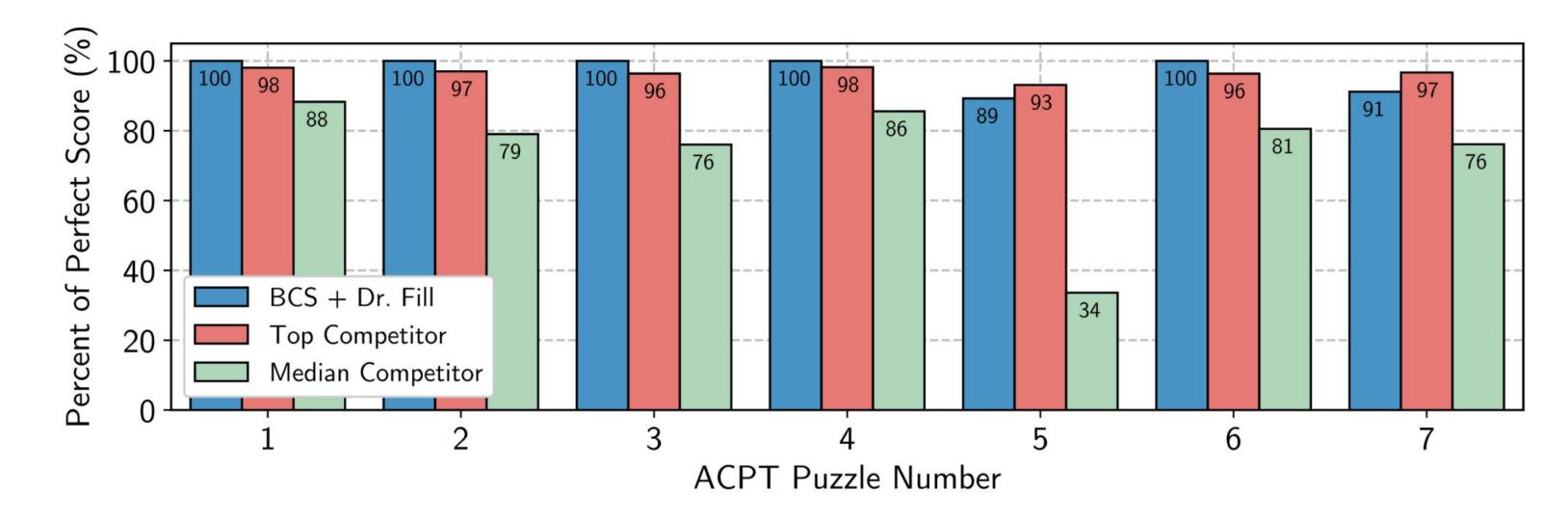


- Question Answering: Use a neural QA model to generate answer probabilities for each clue
- Belief Propagation: Refine answer probabilities by reasoning over crossing answers
- Local Search: Flip and rescore individual characters in the puzzle

## **Key Results**

	Perfect Pu	177le (%)	Letter Acc. (%)		
Source	Dr. Fill	BCS	Dr. Fill	BCS	
The Atlantic	76.6	89.1	99.7	99.8	
Newsday	70.0 88.5	94.2	99.7 <b>99.9</b>	99.8	
The New Yorker	77.3	78.3	99.6	99.8	
The LA Times	87.0	92.6	99.9	99.9	
The New York Times	56.9	<b>81.7</b>	99.4	99.7	

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