ALT TEXT FOR ALL

How deep learning can improve accessibility on Twitter

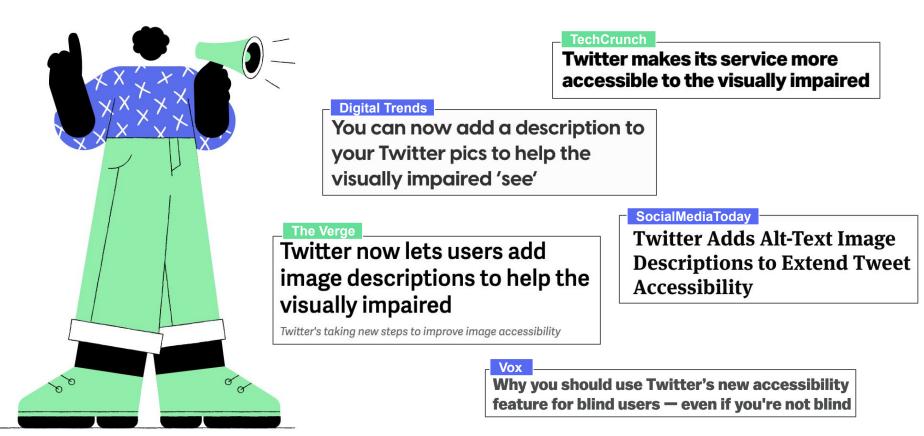


WHAT IS **ALT TEXT** & WHY **DOES IT MATTER?**

- Alternative text is a textual description of rich content (e.g. images) on a webpage.
- It is read by screen readers in place of images allowing the content of the image to be accessible to those with visual or certain cognitive disabilities.
- Adding alternative text for images has been referred to as "the first principle of web accessibility."

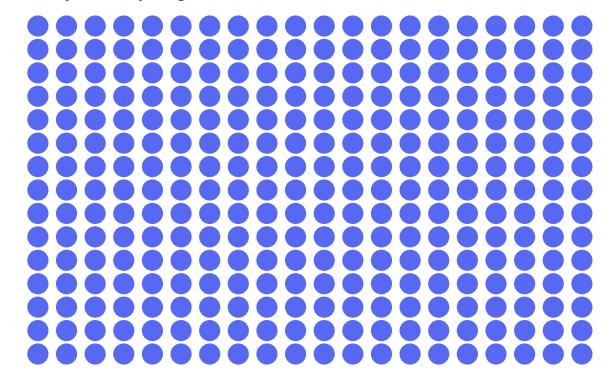
As social media becomes increasingly prevalent and visual, making rich content accessible on social media is critical.

Twitter first released alt text support in 2016, and the announcement was met with great enthusiasm.



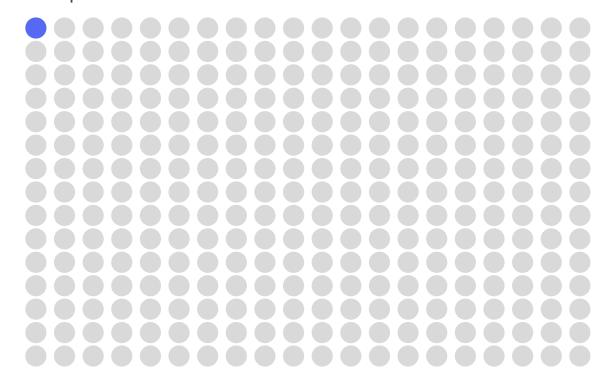
Out of 300 images shared on Twitter, how many would you guess have alt text?

BUT HAS ADOPTION CAUGHT ON?



BUT HAS ADOPTION CAUGHT ON?

Only 1 in 300 images shared on twitter has user-provided alt text.

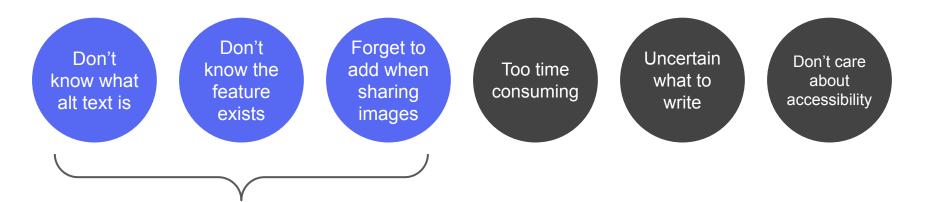


Don't know what alt text is Don't know the feature exists Forget to add when sharing images

Too time consuming

Uncertain what to write

Don't care about accessibility



ADDRESS WITH UI UPDATES

Updated UI could explicitly prompt users to write alt text when an image upload is detected, and share information about what alt text is.

User research from informal interviews and 2019 paper "It's almost like they're trying to hide it": How User-Provided Image Descriptions Have Failed to Make Twitter Accessible

Don't Forget to Uncertain Don't Don't care know the add when Too time know what what to about feature sharing accessibility alt text is write exists images

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AUTOMATE WITH DEEP LEARNING

Train a caption generation model to generate suggested alt text that the user can approve, edit, or reject.

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Don't Forget to Uncertain Don't Don't care know the add when Too time know what what to feature sharing consuming alt text is write exists images Not our target user

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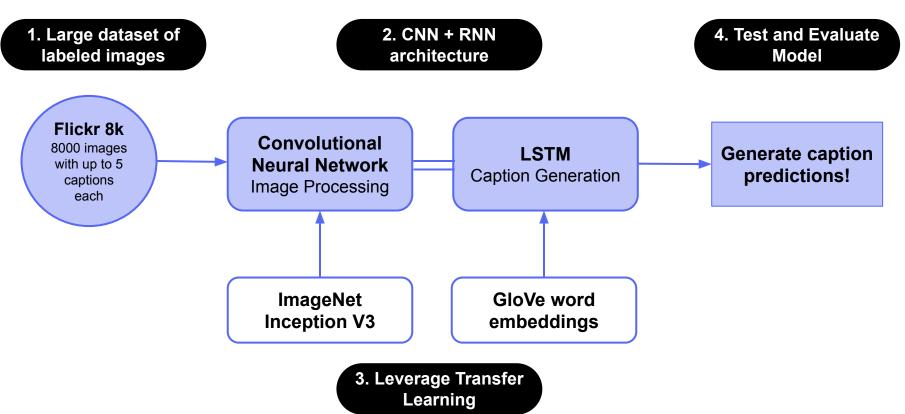
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BUILDING AN ALT TEXT GENERATION MODEL



Modeling Workflow



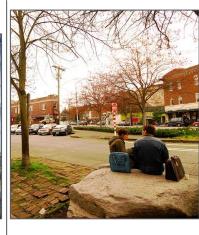
Thank you to Jeff Heaton for his image caption tutorial

Model Performance on Flickr Test Set









Actual man in blue rock Caption climbing

small white dog is running across grassy field

man wearing black shirt standing in front of red brick wall

two people sit on large rock near city street

man climbing rock wall

white dog with brown spots is running through the grass

man in black shirt and tie is standing in front of store

man in black shirt and jeans is walking past houses

Caption GO Rating

Predicted

Caption

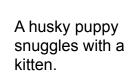




POOR

Model Performance on Twitter Images







A sweater with Dolly Parton dressed as Santa, captioned "tis the season to be Dolly"



My weird avatar standing by some mint green virtual armchairs



digital drawing of a toad, its skin made to look like the surface of the moon (stylized) on a starry background photo

Predicted Caption two dogs are playing in the snow

Actual

Caption

playing in the snow woman with curly hair is holding violin and smiling

man in blue shirt is standing in front of building with his arms crossed

white dog is playing with multicolored stuffed animal

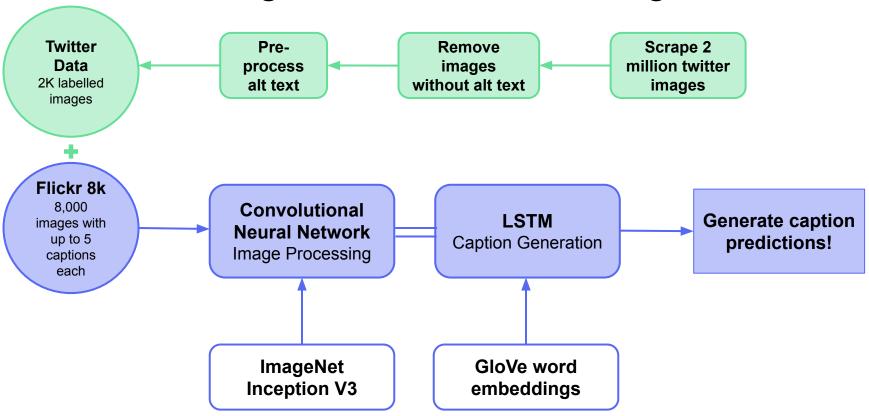
Caption FA Rating

PO

POOR

POOR

Adding Twitter Data to Training Set



Result: Twitter images too varied to be represented adequately in the small sample.

What kinds of non-photographic images are common on Twitter?

Text Screencaps & Memes





Clusters 16, 19

Computer games

Clusters 9, 12









Dark Mode Screencaps











Art



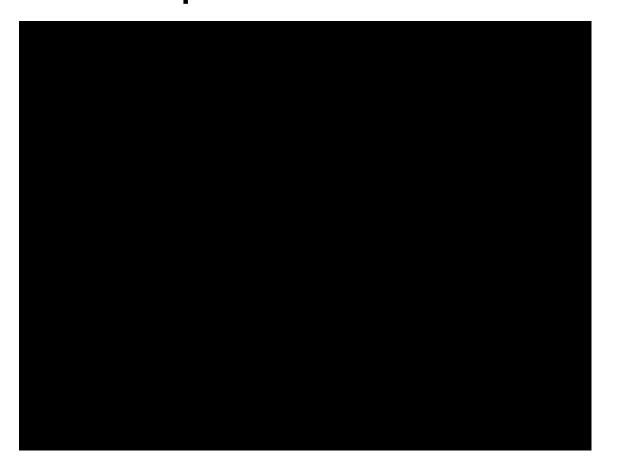
Clusters 2, 11

Cluster 7



NUDGING USERS TO ADD ALT TEXT

Proof of Concept: Chrome Browser Extension



CONCLUSIONS

DEEP LEARNING IS MOVING FAST

Image captioning models have made tremendous progress in just the past six years¹ with the growing accessibility of deep learning.

OPPORTUNITY FOR SOCIAL MEDIA PLATFORMS

While creating big datasets for deep learning is typically difficult, social media platforms have massive extant datasets of user-labeled images.

DESIGN NEEDS TO PRIORITIZE ACCESSIBILITY

The most significant barrier to alt text adoption is actually a lack of awareness of the feature. Accessibility features need to be prominent within the user experience.



A MODEL IS **ONLY AS** GOOD AS THE DATA IT **LEARNS FROM**

Classic Image Caption Datasets

- Flickr datasets: mainly human and animal photographs labelled by MTurk workers
- Microsoft COCO: photographs spanning 91 object categories "easily recognizable by a 4 year old" labelled by MTurk workers
- → Photographs, expensive to label

Twitter Images

- A much broader and more diverse domain of images
- Despite low alt text adoption rate, still massive dataset of user-labeled images
 - → Diverse images, freely labeled

Topic Modeling

- Images of text:
 - Spotify wrapped screenshots (+other screenshots)
 - Book covers
- Image categories:
 - Christmas
 - Selfies
- Was also helpful in identifying "junk" alt text, i.e. auto-generated, not helpful