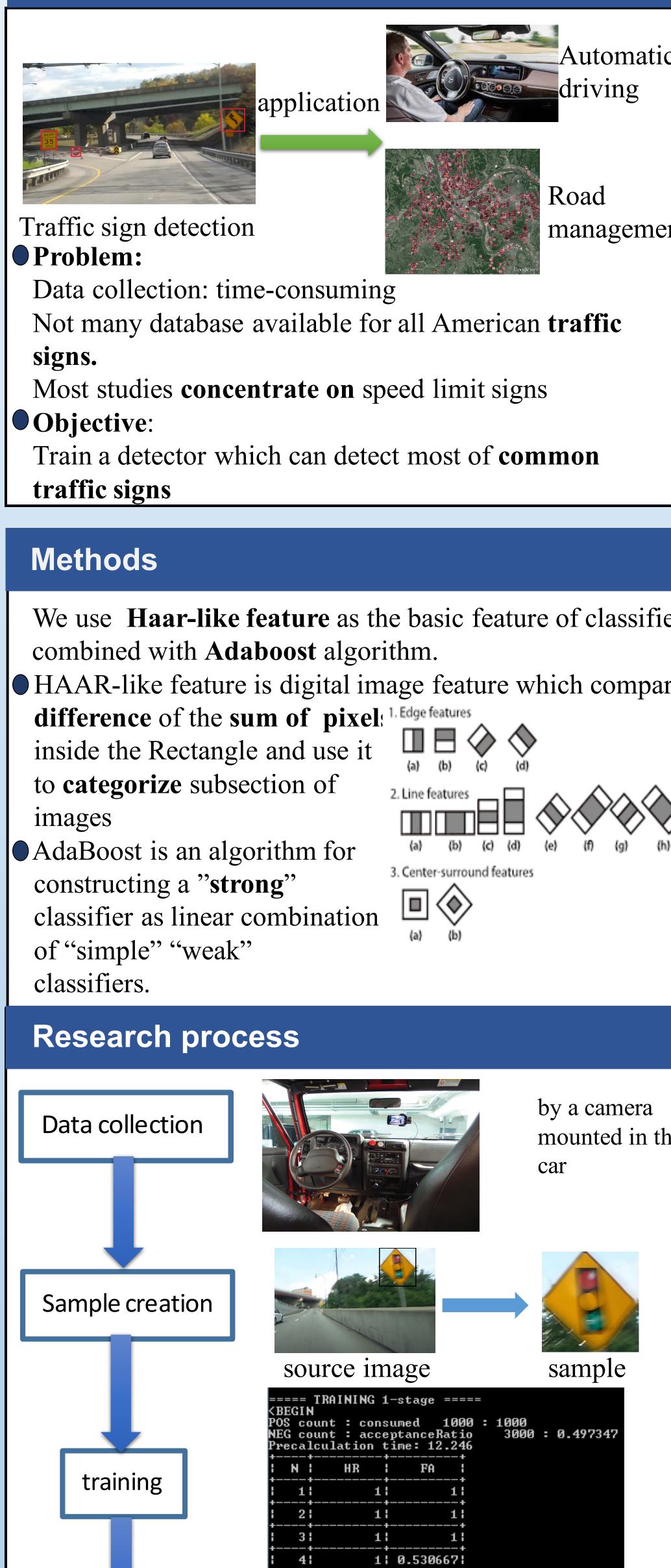






Introduction

detection



False negative

Traffic Sign Detection With Cell Phone Data

Zhenyu Zhou & Junpeng Wang **Mentor: Christoph Mertz**

Detection tes	t and Res	ults						
1. Single sign Detec								
Goal: Find reasona	able paramete	ers by sm	nall sa	mple trai	ning			
h	dataat			nII:4Data	mar Falsa Alam	mData	dotoot	mis
w h data1 16 10		data1		nHitRate 0.995	maxFalseAları 0.5	mkate	detect 22	25
data2 16 20		data1		0.995	0.5		28	19
data3 20 20		data3		0.995	0.7		12	35
		data4		0.996	0.6		30	17
Results:		data5		0.998	0.6		40	7
 Ratio of width to MinHitRate and a detection result (a recommended he 2. Mixed signs Detection 	maxFalseAla minHitRate: ere based on e	armRate 1 0.998 wit	have a	n great in	fluence of	n the		fier's
Goal: Verify the c categories.	classifier's pe	erformand	ce wh	ile sampl	e dataset o	conta	ins di	fferer
COFF	0			stop	signs	spe	ed lim	it sigr
STOP	T			detected			cted	misse
	sto	p signs of	nly	27	2			
2	- TE .	limit sign	-			52	2	1
		oth(16 16	-	27	2	34	4	19
Very different features!		oth(16 20	,	28	1	4	8	5
 Results: Basically the classicategory has eno The size of traffitraining a classified 	ough different c sign sample	t samples es should	s. I be ta					
 Basically the classicategory has eno The size of traffit training a clssifie 	ough different c sign sample er with differ	t samples es should ent signs	s. l be ta	ken into	considerat	tion v	when	nanc
 Basically the class category has eno The size of traffi 	ough different c sign sample er with differ	t samples es should ent signs	s. l be ta orovi	ken into	considerat	tion v	when	
 Basically the classicategory has eno The size of traffit training a clssifie Solution to lac 	ough different c sign sample er with differ of sample	t samples es should ent signs	s. l be ta orovi	ken into	considerat	tion v per g(add	when form I false	e nega
 Basically the classicategory has eno The size of traffit training a classifie Solution to lac Problem 	ough different c sign sample er with differ of sample e test images	t samples es should ent signs	s. l be ta orovi	ken into	considerat	tion w per g(add ples a	when form I false	e nega
 Basically the classicategory has eno The size of traffit training a classifie Solution to lac Problem Some signs in the are missed by the 	ough different c sign sample er with differ of sample e test images e classifier	t samples es should ent signs	s. l be ta orovi	ken into	considerat	tion w per g(add ples a	when form I false	e nega
 Basically the classicategory has eno The size of traffit training a classifie Solution to lac Problem Some signs in the are missed by the 	ough different c sign sample er with differ of sample e test images	t samples es should ent signs	s. l be ta orovi	ken into	considerat	tion w per g(add ples a	when form I false	e nega
 Basically the classicategory has eno The size of traffit training a classifie Solution to lac Problem Some signs in the are missed by the 	ough different c sign sample er with differ of sample e test images e classifier st1	t samples es should ent signs	s. l be ta orovi	ken into	considerat ssifier's Boosting test sam classifie	tion v per g(add ples a r)	when form I false	e nega
 Basically the classicategory has eno The size of traffit training a clssifie Solution to lac Problem Some signs in the are missed by the 	ough different c sign sample er with differ of sample e test images e classifier st1	t samples es should ent signs	s. l be ta orovi	ken into	considerat sifier's Boosting test sam classifie	tion v per g(add ples a r)	when form I false	e nega
 Basically the classicategory has eno The size of traffitration of the size of traffitration. Problem Some signs in the are missed by the size of the size of the size of traffitration. Image: The size of traffitration of the size of traffitration of the size of traffitration. Image: The size of traffitration of the size of traffitration of the size of traffitration. Image: The size of traffitration of the size of traffitration of the size of traffitration. Image: The size of traffitration of the size of traffitration of the size of traffitration. Image: The size of traffitration of traffitration of the size of traffitration of the size of traffitration. Image: The size of traffitration of the size of traffitration of the size of traffitration. Image: The size of traffitration of the size of traffitration of the size of traffitration. Image: The size of traffitration of the size of traffitration of the size of traffitration. Image: The size of traffitration of the size of traffitration of the size of traffitration. Image: The size of traffitration of the size of traffitration of the size of traffitration of the size of traffitration. Image: The size of traffitration of of	ough different c sign sample er with differ of sample e test images e classifier st1 79%	t samples es should ent signs	s. l be ta orovi	ken into ng clas Solution Solution missed detecte test1:crea test2:crea	considerat sifier's Boosting test sam classifie	tion v per g(add ples a r) %	when form I false and re limit si I limit	e nega etrain
 Basically the classicategory has eno The size of traffitration of the size of traffitration. Problem Some signs in the are missed by the size of the size of the size of traffitration. Image: The size of traffitration of the size of traffitration of the size of traffitration. Image: The size of traffitration of the size of traffitration of the size of traffitration. Image: The size of traffitration of the size of traffitration of the size of traffitration. Image: The size of traffitration of the size of traffitration of the size of traffitration. Image: The size of traffitration of traffitration of the size of traffitration of the size of traffitration. Image: The size of traffitration of the size of traffitration of the size of traffitration. Image: The size of traffitration of the size of traffitration of the size of traffitration. Image: The size of traffitration of the size of traffitration of the size of traffitration. Image: The size of traffitration of the size of traffitration of the size of traffitration. Image: The size of traffitration of the size of traffitration of the size of traffitration of the size of traffitration. Image: The size of traffitration of of	ough different c sign sample r with differ of sample e test images e classifier st1 79%	t samples es should ent signs	s. l be ta orovi	ken into ng clas Solution Solution missed detecte test1:crea test2:crea test3:app	considerat ssifier's Boosting test sam classifie test2 (13%) 87 ed ate from 5 s ate from 10 bying boost	tion v per g(add ples a r) %	when form I false and re and rest	e nega etrain
 Basically the classicategory has eno The size of traffitration of the size of traffitration. Problem Some signs in the are missed by the size of the size of the size of traffitration. Image: The size of traffitration of the size of traffitration of the size of traffitration. Image: The size of traffitration of the size of traffitration of the size of traffitration. Image: The size of traffitration of the size of traffitration of the size of traffitration. Image: The size of traffitration of the size of traffitration of the size of traffitration. Image: The size of traffitration of traffitration of the size of traffitration of the size of traffitration. Image: The size of traffitration of the size of traffitration of the size of traffitration. Image: The size of traffitration of the size of traffitration of the size of traffitration. Image: The size of traffitration of the size of traffitration of the size of traffitration. Image: The size of traffitration of the size of traffitration of the size of traffitration. Image: The size of traffitration of the size of traffitration of the size of traffitration of the size of traffitration. Image: The size of traffitration of of	ough different c sign sample r with differ of sample e test images e classifier st1 79%	t samples es should ent signs	s. l be ta orovi	ken into ng clas Solution Solution missed detecte test1:crea test2:crea test3:app	considerat ssifier's Boosting test sam classifie test2 (13%) 87 ed ate from 5 s ate from 10 lying boost	tion v per g(add ples a r) %	when form I false and re and rest	e nega etrain

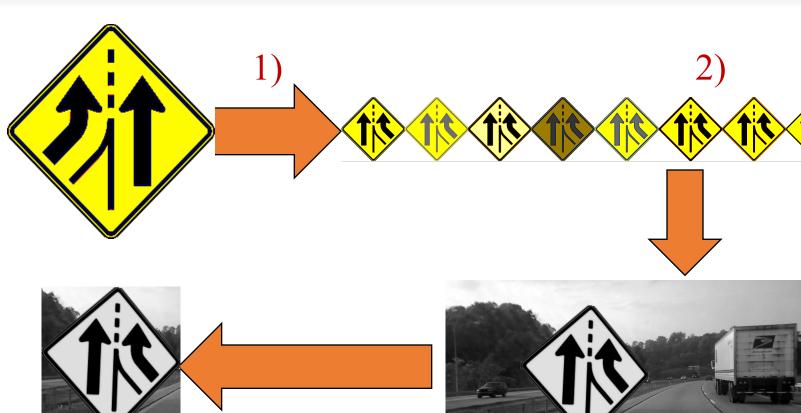


Results:

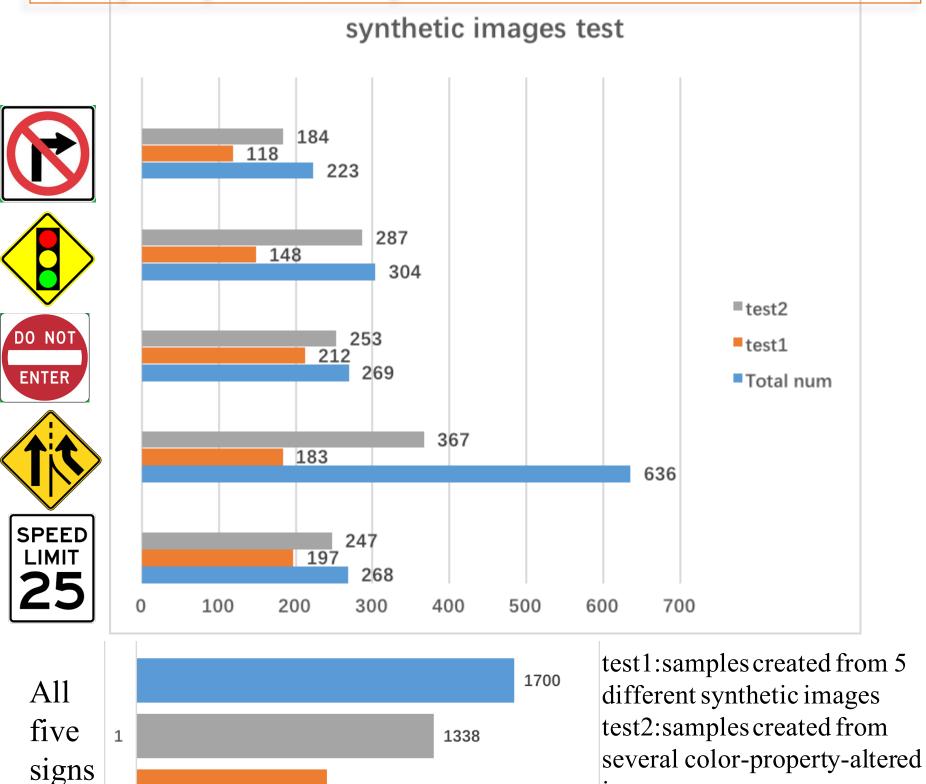
Classifier's accuracy would generally be **risen up** with more image samples with different features added to the sample set.

- Boosting could improve the classifier's performance in an efficient way.
- **Improved method**:

Creating 10 images from one synthetic image by changing its property(exposure, contrast, saturation.)



1)Original sample 2)Create 10 different samples 3)Place the sample on a background 4)Crop the positive sample out



Results:

After applying the new method above, most of the classifier's test performance has a huge promotion.

images

Conclusion

The Classifier's performance depends on the test object's shape, sample quality, parameters and so on. By applying methods like creating samples from synthetic image and boosting, we can train a classifier which could finally detect variety of common signs both accurately and at low cost.

Acknowledgement

We would like to thank RI for giving us this precious opportunity. Especially Thanks to Dr. Christoph for his mentorship. Thanks to Jina, Abhinav, Jahdiel and Sanmi in the Navlab, to Rachel, Mikana and other faculties working on the RI Summer Scholar program.

