

# BOXER: Preventing fraud by scanning credit cards

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# Once upon a time in 2018





Image from "Donnie Brasco, 1997"



Image from "Donnie Brasco, 1997"

Hey, I want  
to be Don  
the jeweler



Image from "Donnie Brasco, 1997"



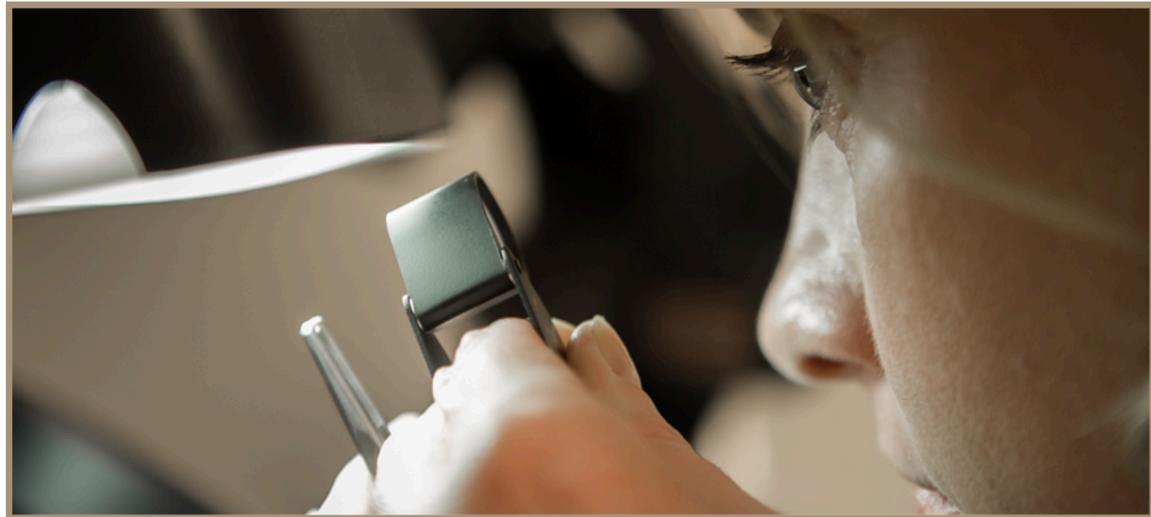
I don't know anything about GEMS

Get a PhD in  
Gemology?



## GRADUATE GEMOLOGIST<sup>®</sup> PROGRAM

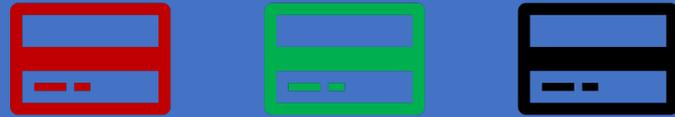
One of the most prestigious credentials in the industry, the GIA Graduate Gemologist<sup>®</sup> program gives you the comprehensive knowledge of diamonds and colored stones you need to succeed anywhere in the jewelry business. You'll gain both technical expertise and practical skills to evaluate gemstones by the 4Cs (color, clarity, cut, and carat weight), the International Diamond Grading System<sup>™</sup>, and the Colored Stone Grading System.



**WHAT YOU'LL LEARN**

**POSSIBLE CAREER PATHS**

<https://www.gia.edu/gem-education/program-graduate-gemologist>



May be look at credit cards, instead

# You're Don the Jeweler, pick the fugazi!



# You're Don the Jeweler, pick the fugazi!



Can we detect *high-quality* fakes?





But why do we care?

# Card not present fraud: What and How?

Card not present fraud happens when fraudsters steal credit card credentials of other people



# Card not present fraud: What and How?

Card not present fraud happens when fraudsters steal credit card credentials of other people



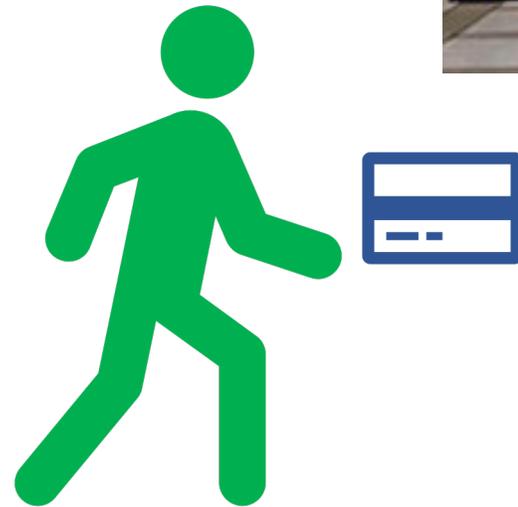
And use these stolen credentials to make purchases online or via an app without the physical card

<b>Card Number</b>	<input type="text" value="Card Number"/>
<b>Expiry Date</b>	<input type="text" value="MM"/> / <input type="text" value="YY"/>
<b>CVV/CVV2</b>	<input type="text" value="CVV"/>
	<input type="button" value="Pay Now"/>

Card  
Present  
Transaction



# Card Present Transaction



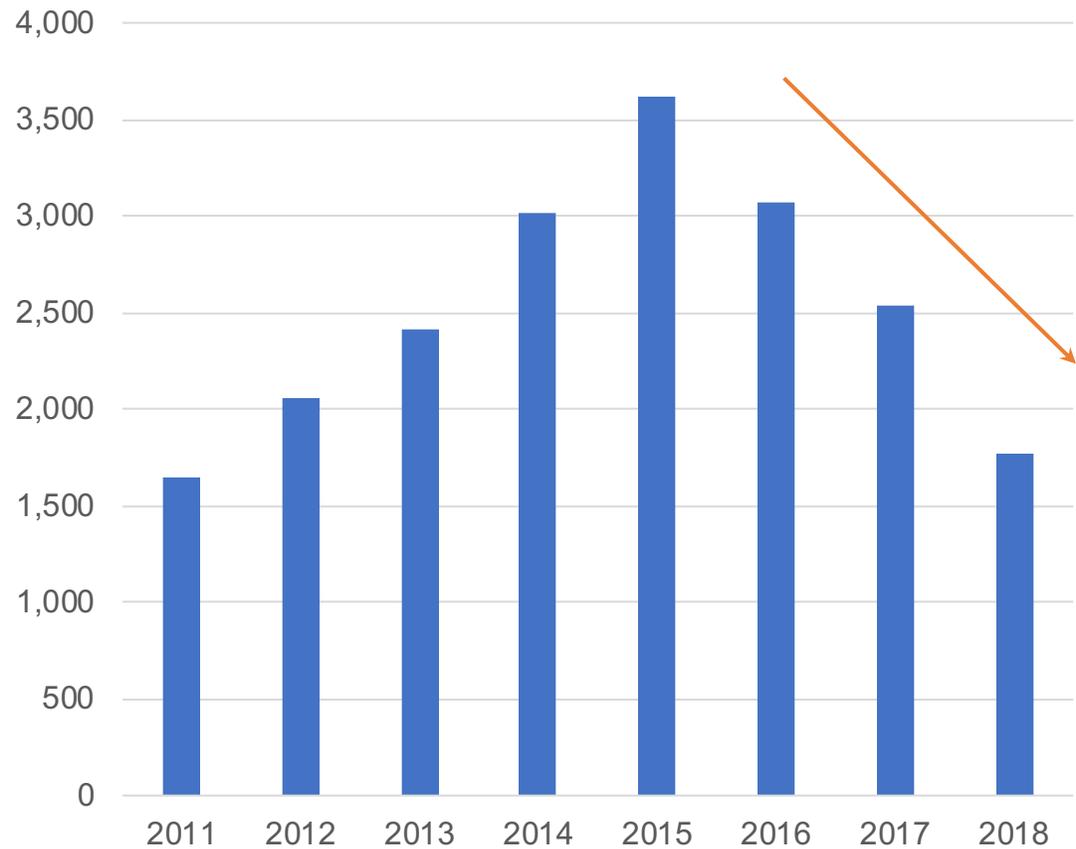
# Card *Not* Present Transaction

The screenshot shows a mobile application interface for adding a card. At the top, the status bar displays the time 9:13 and various system icons. Below the status bar is a black header with a back arrow and the text 'Add Card'. The main form area is white and contains several input fields: 'Card Number' with a camera icon on the right; 'MM/YY' and 'CVV' fields, each with a help icon (a question mark in a circle); 'Country' with a dropdown menu showing 'United States' and a US flag icon; and 'Zip Code'. At the bottom of the form is a grey button labeled 'NEXT'.

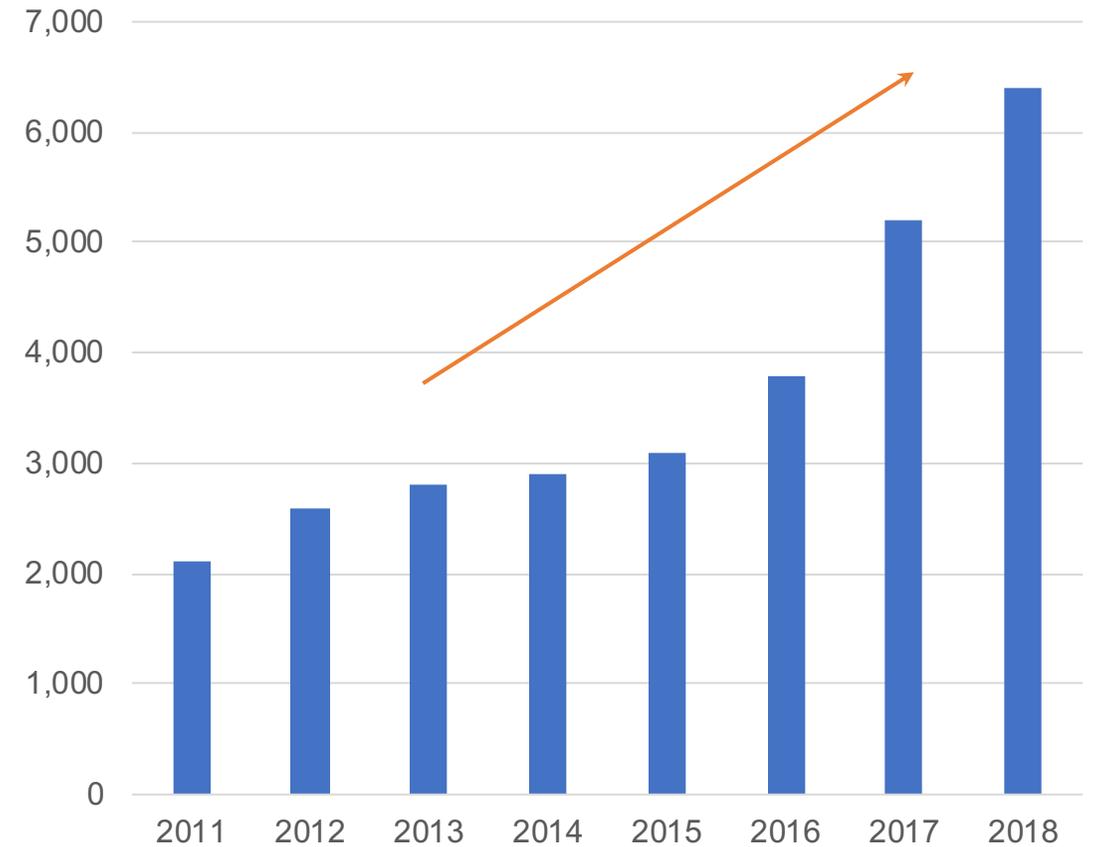
Image from UBER checkout page.

# Card Present Fraud vs Card Not Present Fraud

Losses in \$ mm vs Year



Losses in \$ mm vs Year



Source: <https://www.uspaymentsforum.org/wp-content/uploads/2017/03/CNP-Fraud-Around-the-World-WP-FINAL-Mar-2017.pdf>

and

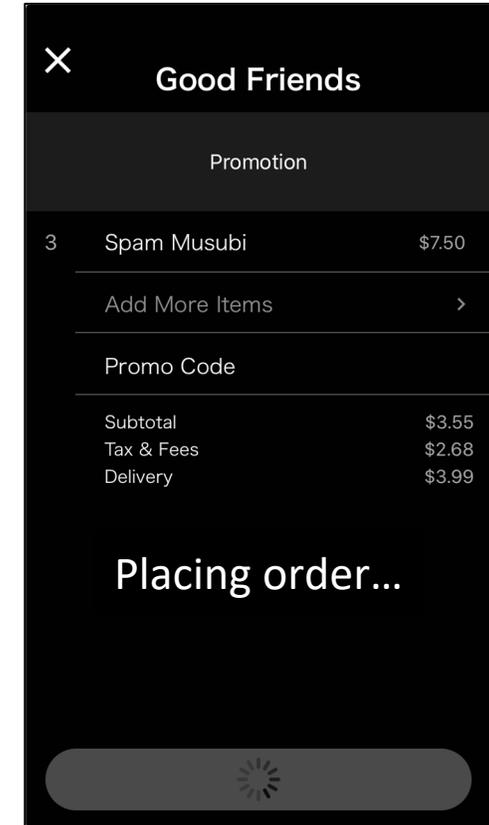
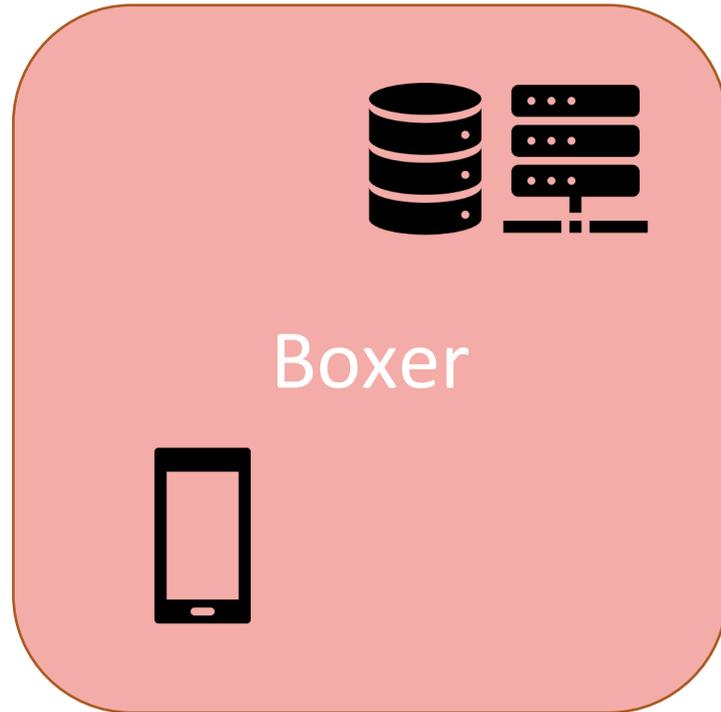
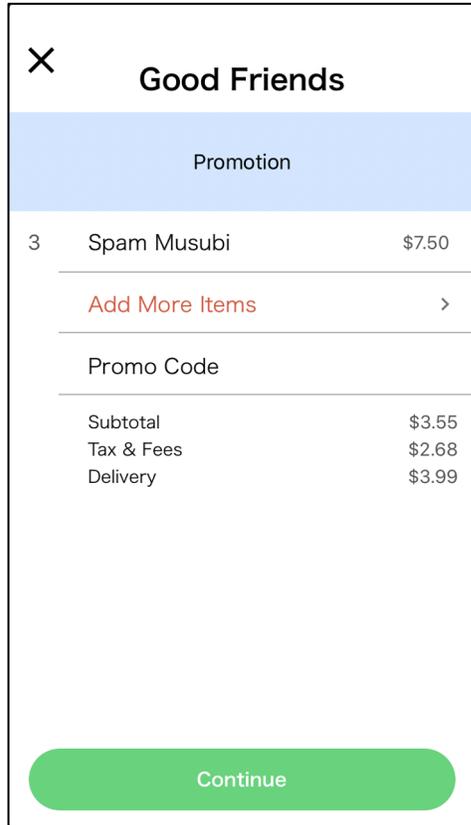
<https://www.businesswire.com/news/home/20190102005011/en>

In fact, researchers found retailers will  
lose some ***\$130 billion*** dollars in  
digital CNP fraud between 2018 - 2023

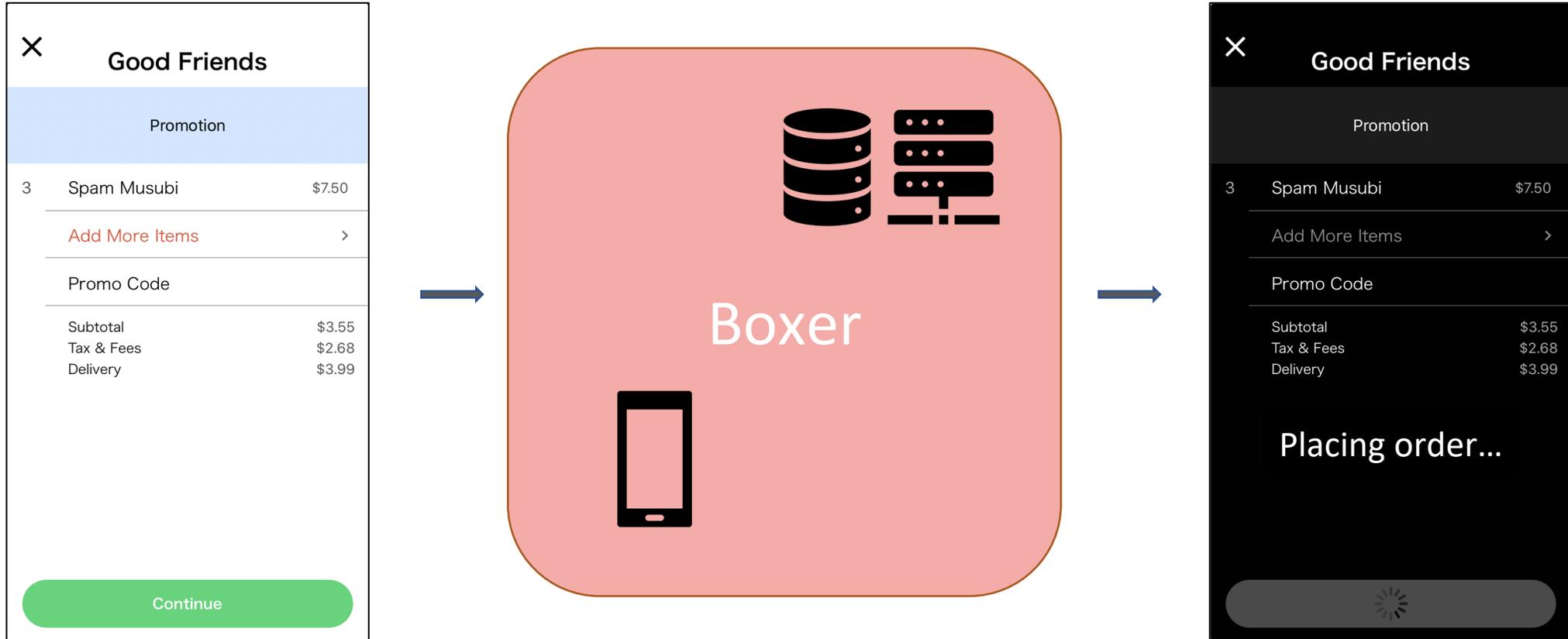
# BOXER



# Boxer: Client-side SDK and server to deter CNP fraud.

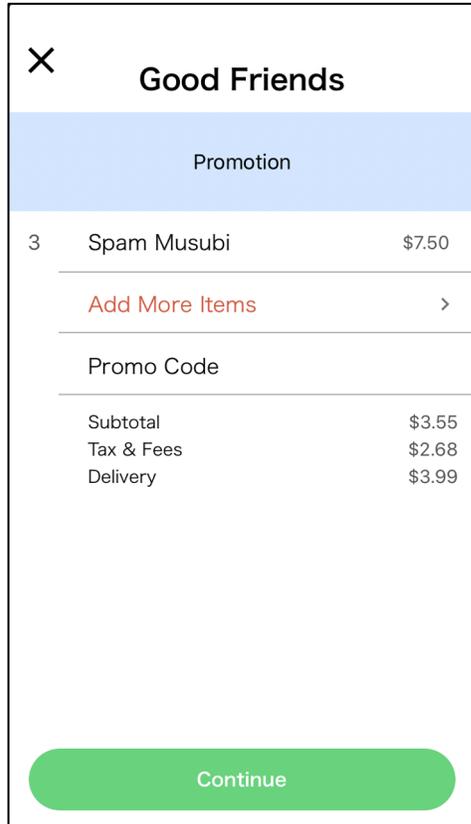


# Boxer: How does it work

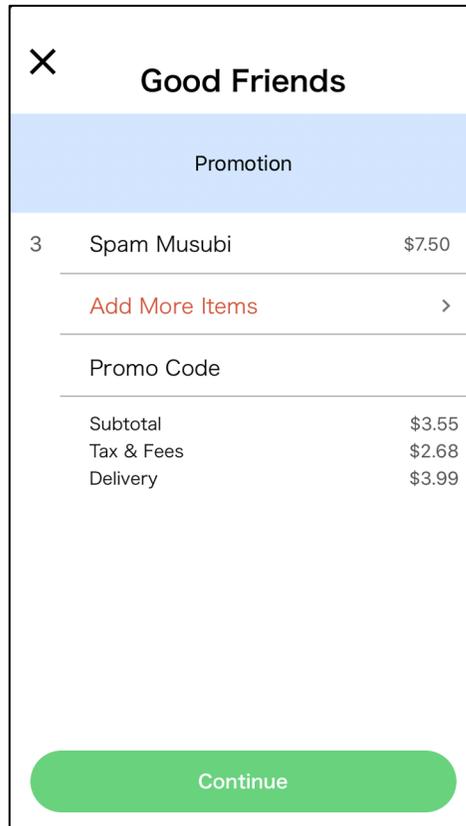


Boxer is used by the food delivery app to verify a suspicious transaction

# Overview: App detects a suspicious transaction and forwards the user to Boxer.

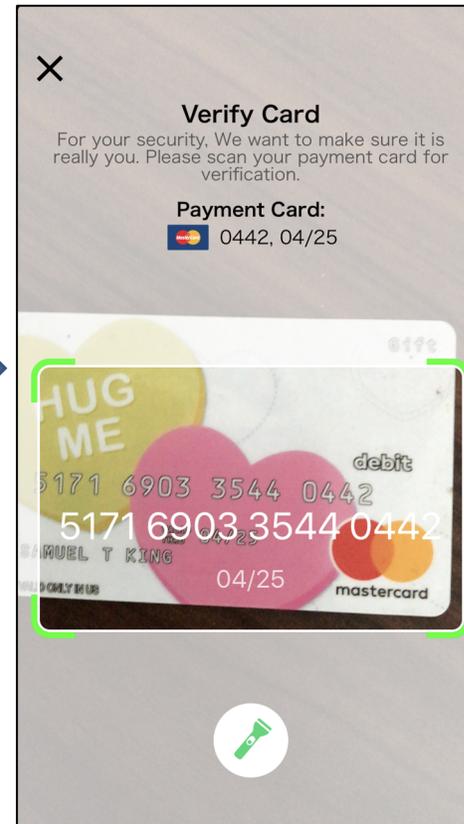
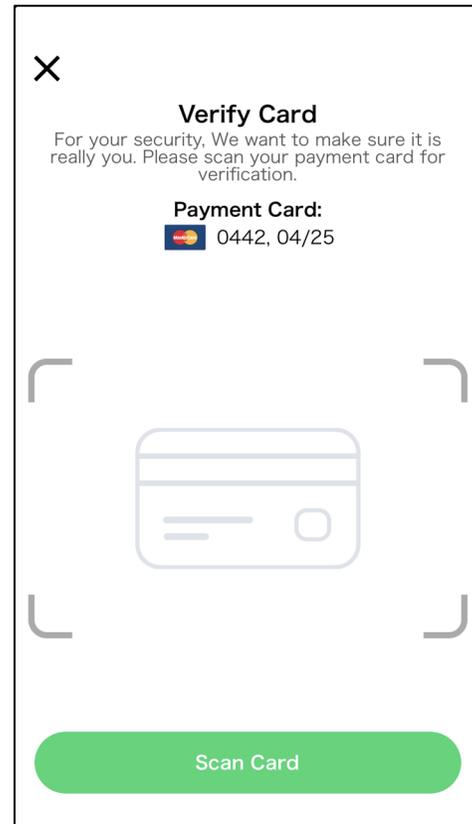
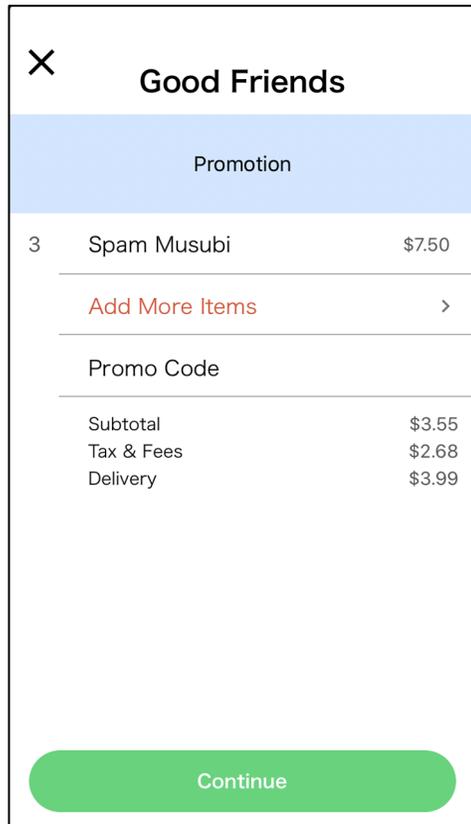
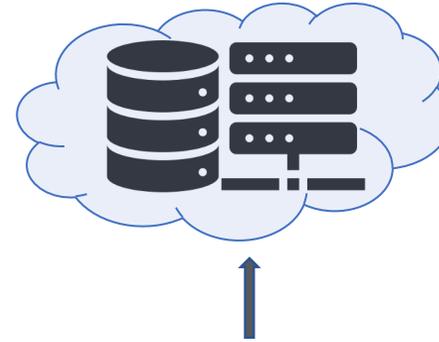


# Overview: Boxer's asks the user to scan their card.

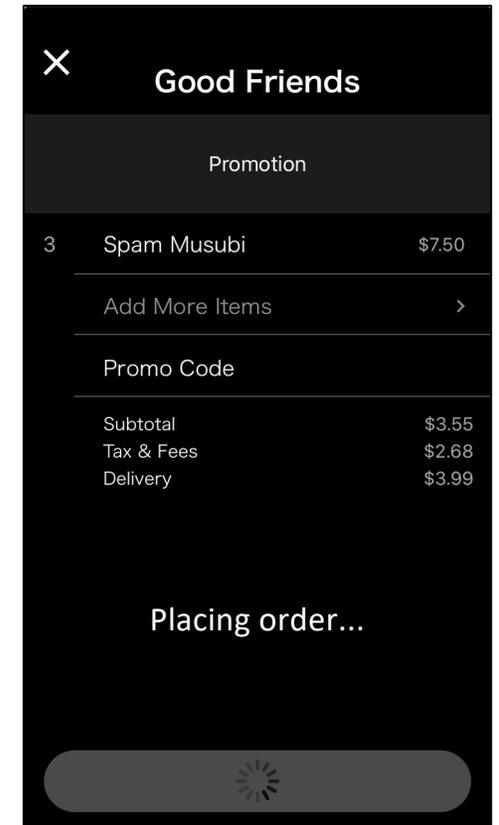
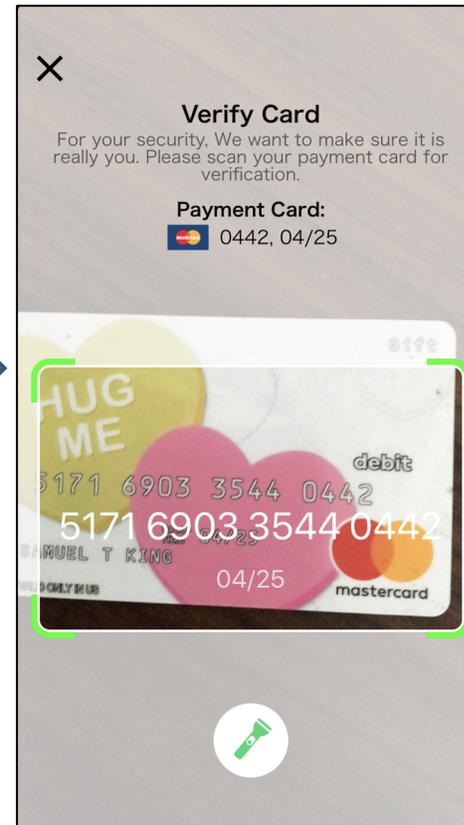
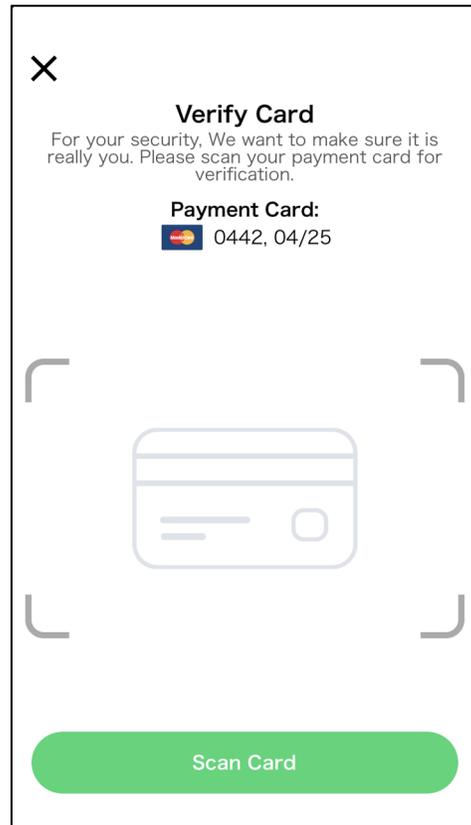
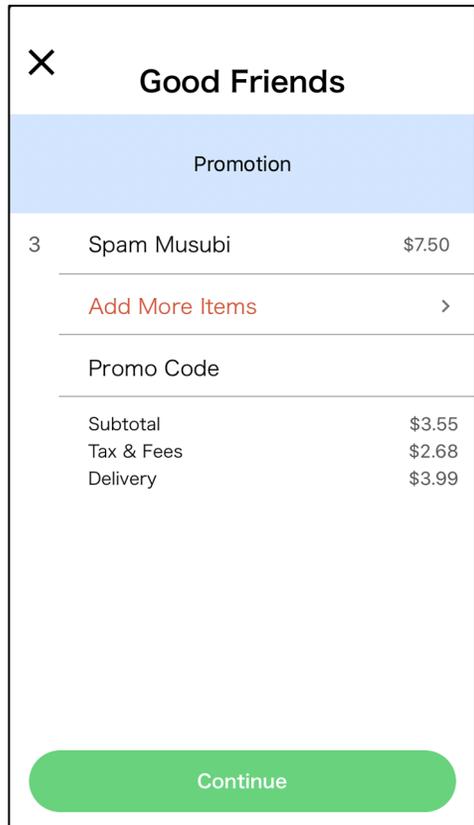
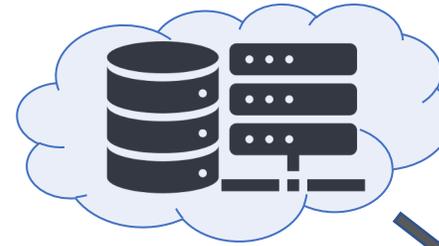


Boxer performs OCR, analyzes the video frames for telltale signs of attacks and collects device signals

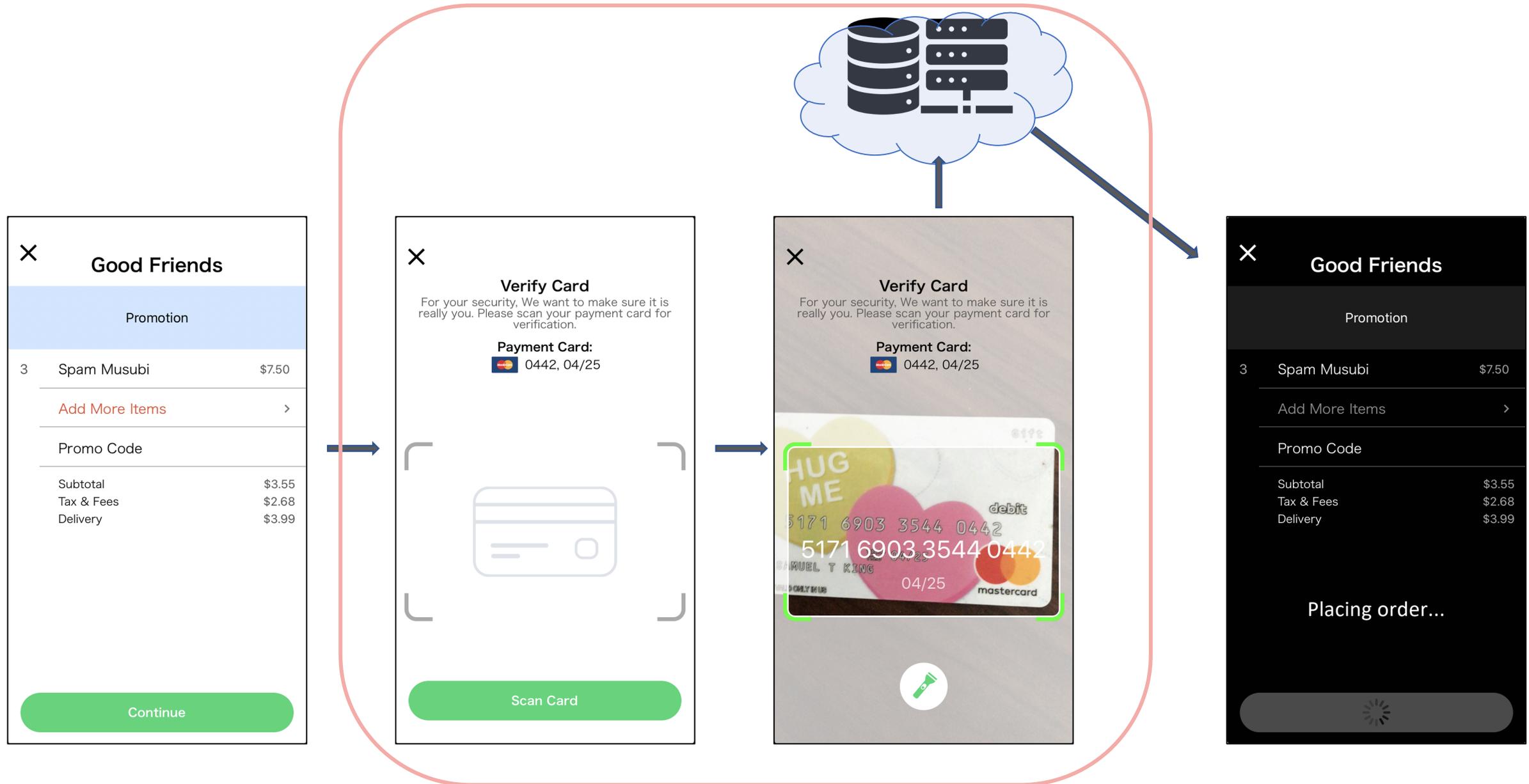
# Overview: Boxer's client SDK sends this data to the Boxer server.



# Overview: Boxer's server decides if the transaction should proceed.



# Boxer: Client SDK and server



# Outline



Image Analysis



Device Signals



Principles



Evaluation



Impact

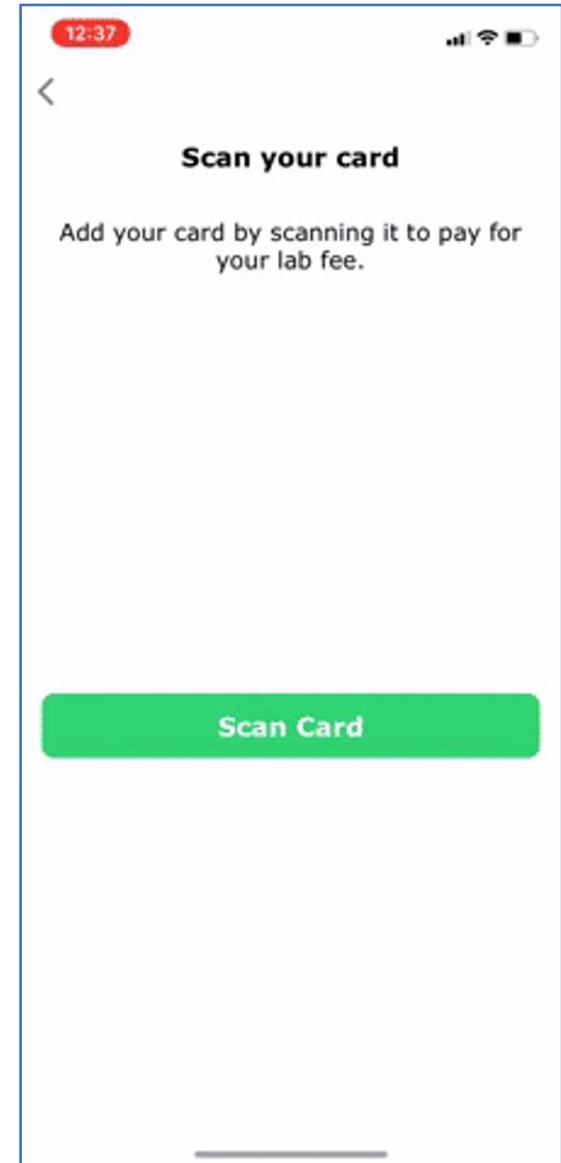


Conclusions

# Image Analysis: OCR

Scan the card to extract card number and expiry and check what is on record

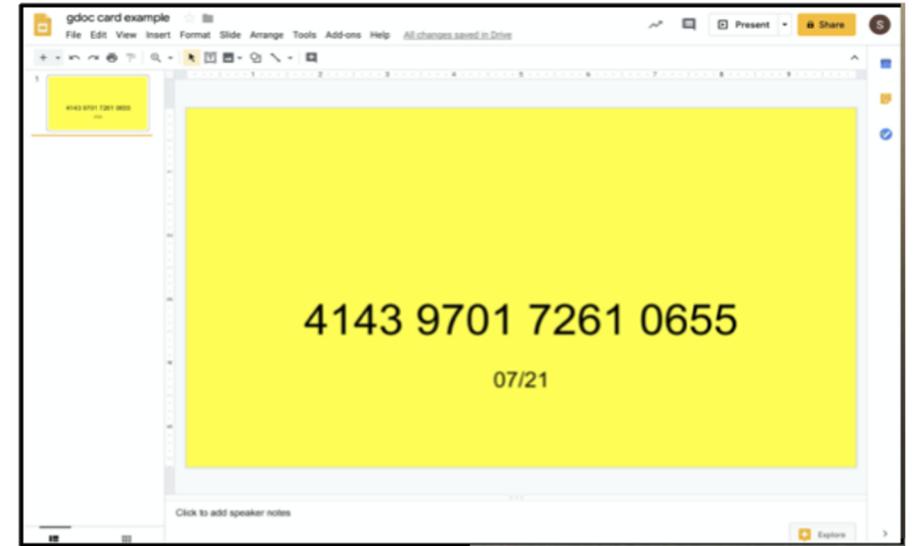
- Perform OCR on the card number and expiry



# Image Analysis: BIN Check

Inspect the card image for tell tale signs of tampering.

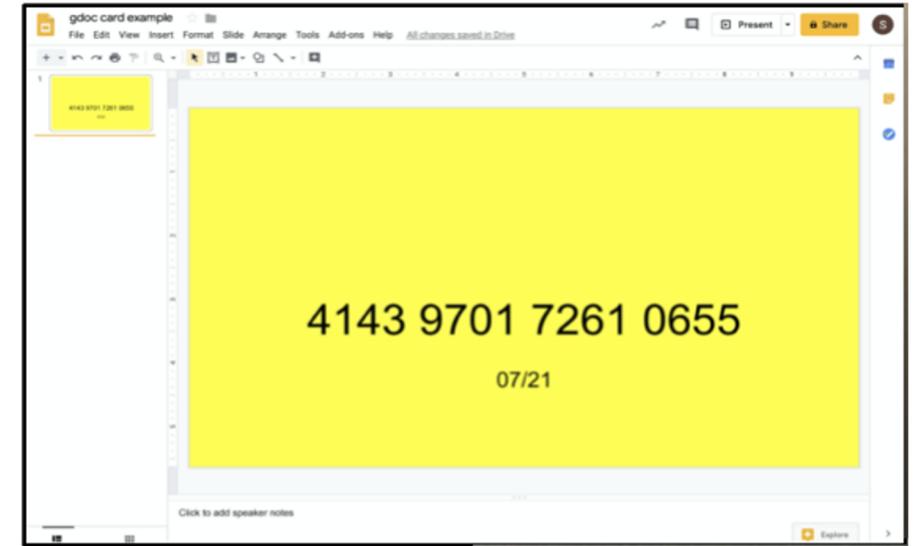
- The image on the top has a Green Dot card number but no objects (like payment network, logo, etc.,)



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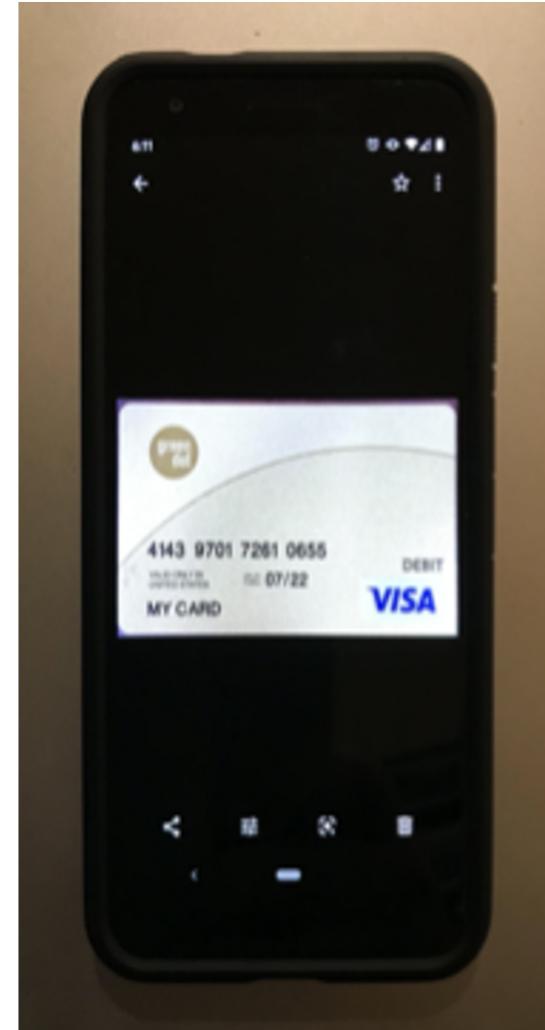
- The image on the top has a Green Dot card number but no objects (like payment network, logo, etc.,)
- The image on the bottom has a Green Dot BIN but a CHASE logo.



# Image Analysis: Screen Detection

Detect ways of rendering fake card images.

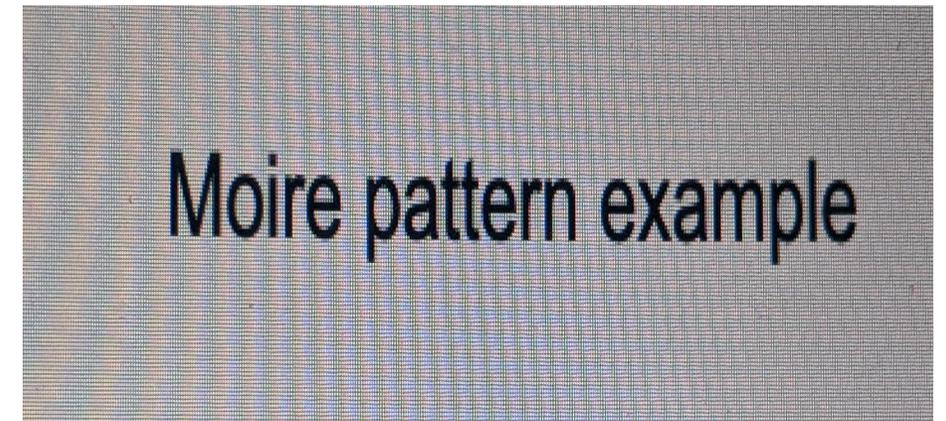
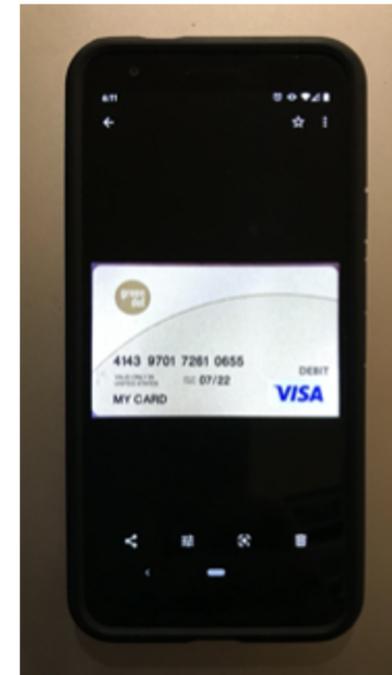
- Detect a card image scanned off a phone by homing in on the edges



# Image Analysis: Screen Detection

Detect ways of rendering fake card images.

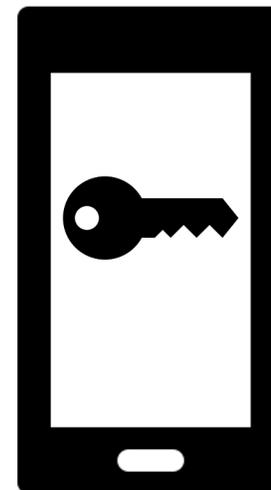
- Detect a card image scanned off a phone by homing in on the edges
- Detect computer screens by detecting Moiré patterns



# Device Signals: DeviceCheck and SafetyNet

Force the attacker to use genuine hardware and the real app.

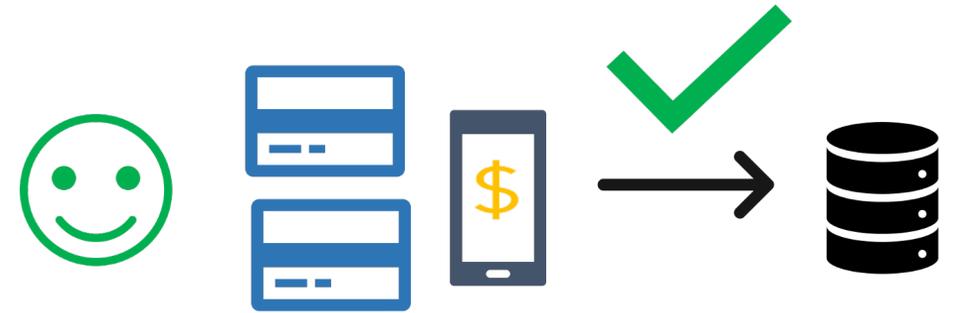
- Use the private key embedded in the hardware to verify it is genuine



# Device Signals: Secure Counting

Associate attacker activities with things that are expensive like iPhones and use that to rate limit.

- Track activities and increment a secure counter when these occur on the same device.



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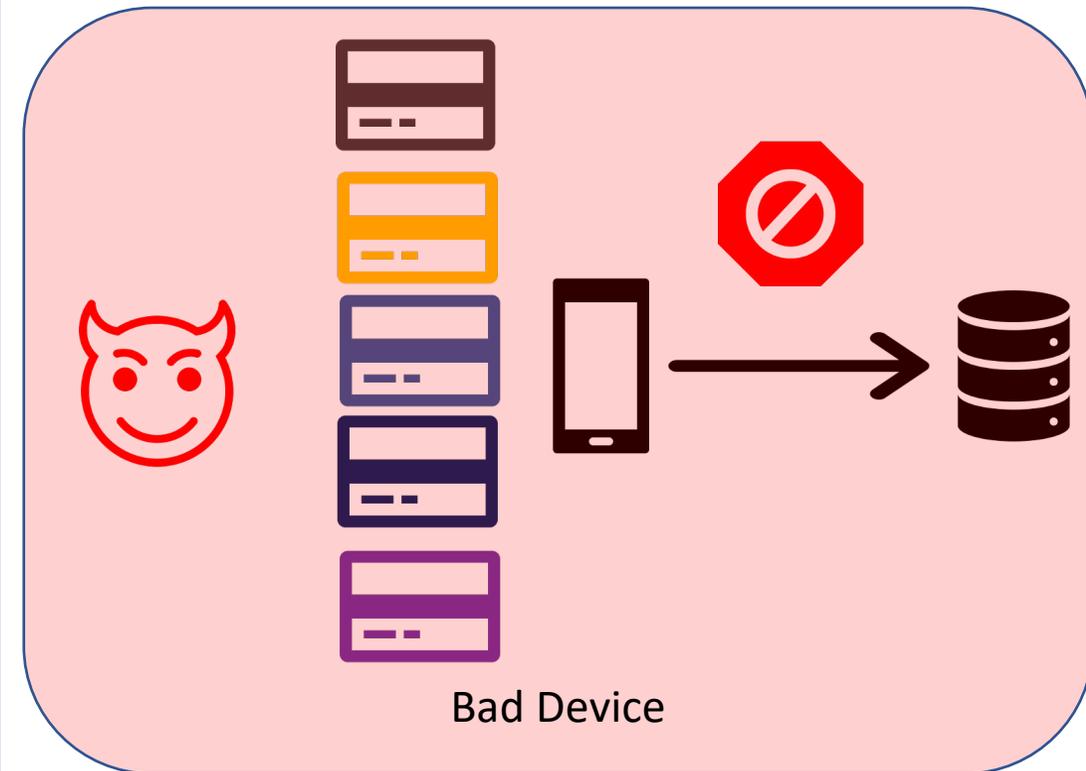
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- For instance, counting the number of cards added per device can limit the damage done by large scale hardware-based attacks.



# Device Signals : Secure Counting

Associate attacker activities with things that are expensive like iPhones and use that to rate limit.

- Track activities and increment a secure counter when these occur on the same device.
- For instance, counting the number of cards added per device can limit the damage done by large scale hardware-based attacks.
- Boxer's secure counter is privacy preserving since it only identifies classes of devices and not each individual device.



# Boxer design principles



## Scan

Scan the card to extract relevant details and check what is on record



## Inspect

Inspect the card image for tell tale signs of tampering.



## Detect

Detect ways of rendering fake card images.



## Force

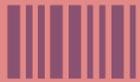
Force the attacker to use genuine hardware



## Associate

Associate attacker activities with things that are expensive for secure rate limiting.

# Boxer design principles



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Scan the card to extract relevant details and check what is on record



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Inspect the card image for tell tale signs of tampering.



## Detect

Detect ways of rendering fake card images.

Image analysis



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Force the attacker to use genuine hardware and the real app.



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Device signals

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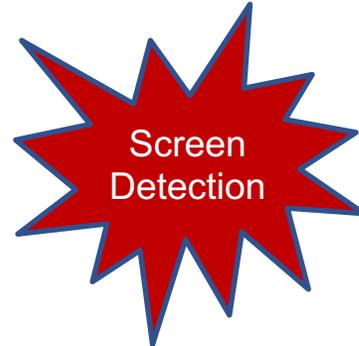
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# Boxer design principles



## Scan

Scan the card to extract relevant details and check what is on record



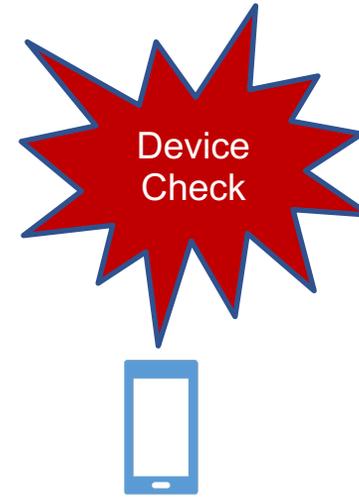
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Scan the card to extract relevant details and check what is on record



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## Detect

Detect ways of rendering fake card images.



## Force

Force the attacker to use genuine hardware



Secure Counter



## Associate

Associate attacker activities with things that are expensive for secure rate limiting.

# Evaluation: Boxer's net effect end to end.

We report results from an app that allowed users flagged by their system to verify themselves with Boxer.

For two weeks in February 2020, 45 users were sent to Boxer for verification.



# Evaluation: Boxer's net effect end to end.

35 of these users failed OCR and were blocked by Boxer.

A manual review by the app later confirmed all 35 users to have been fraudulent.



# Evaluation: Boxer's net effect end to end.

Of the remaining users, 8 passed Boxer's challenge and were allowed to complete their transactions.

A manual review conducted by the app later confirmed Boxer's decisions to be accurate.



# Evaluation: Boxer's net effect end to end.

Of the remaining 2 users, one was caught by Boxer's secure counter and the other was flagged by Boxer's screen detection.

The user caught by secure counter was confirmed by manual review to be a fraudster.

The other user caught by screen detection was confirmed to be a false positive by manual review.



# Evaluation: Boxer's net effect end to end.

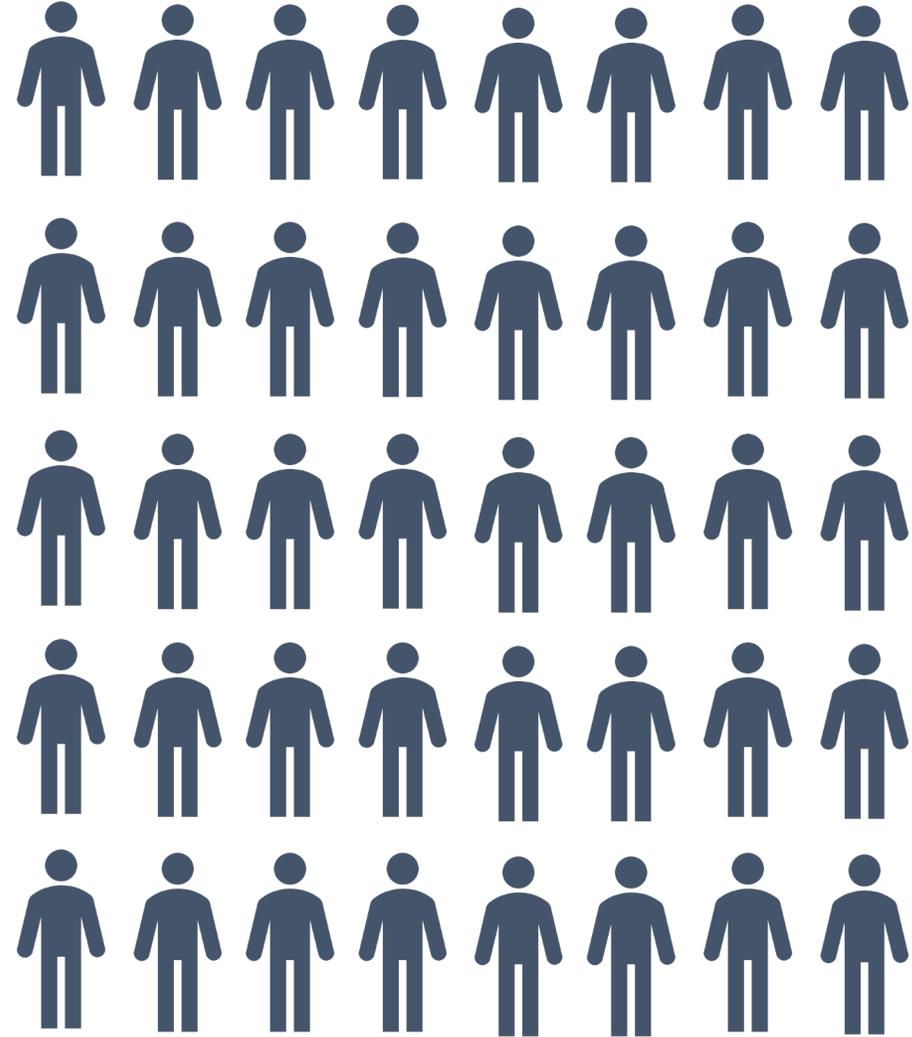
Thus, Boxer recovered **89%** of the app's legitimate users without incurring additional fraud.



# Impact

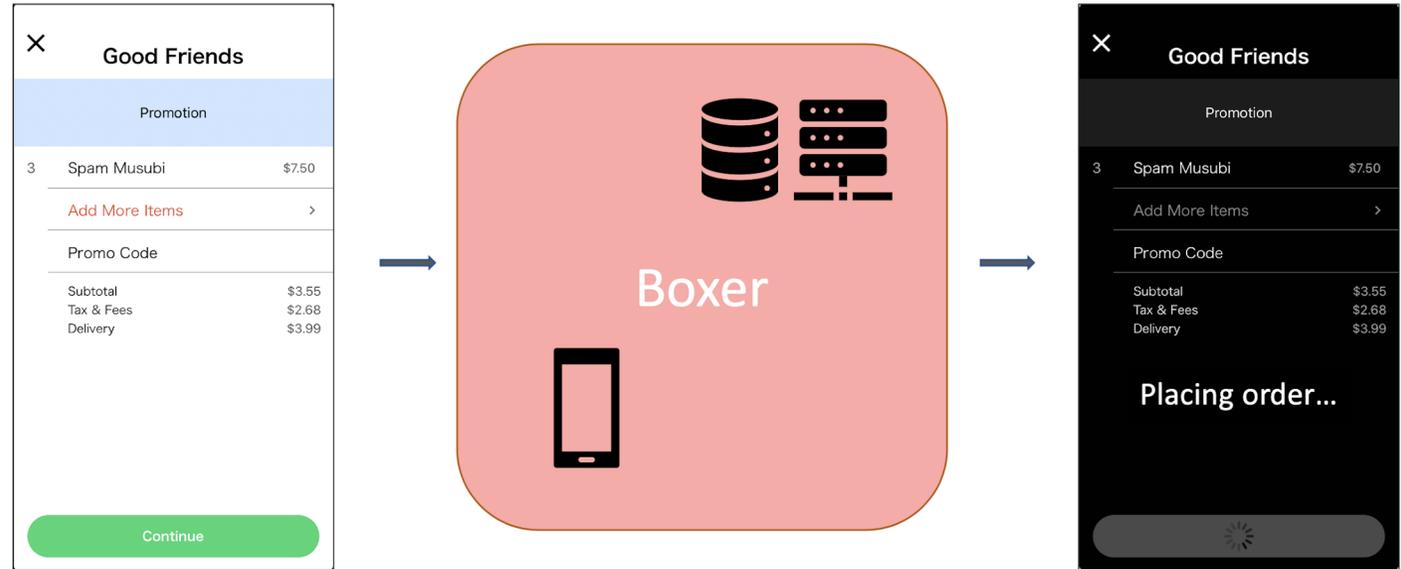
So far 323 apps have integrated Boxer, many of them have deployed Boxer in production.

Boxer has scanned over 10 million cards and is currently actively stopping fraud.



# Conclusions

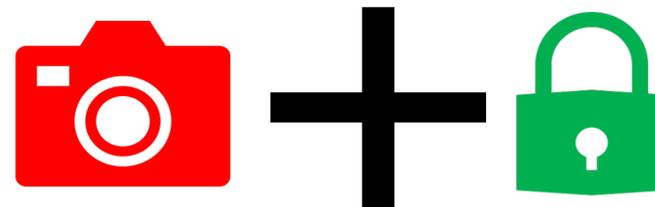
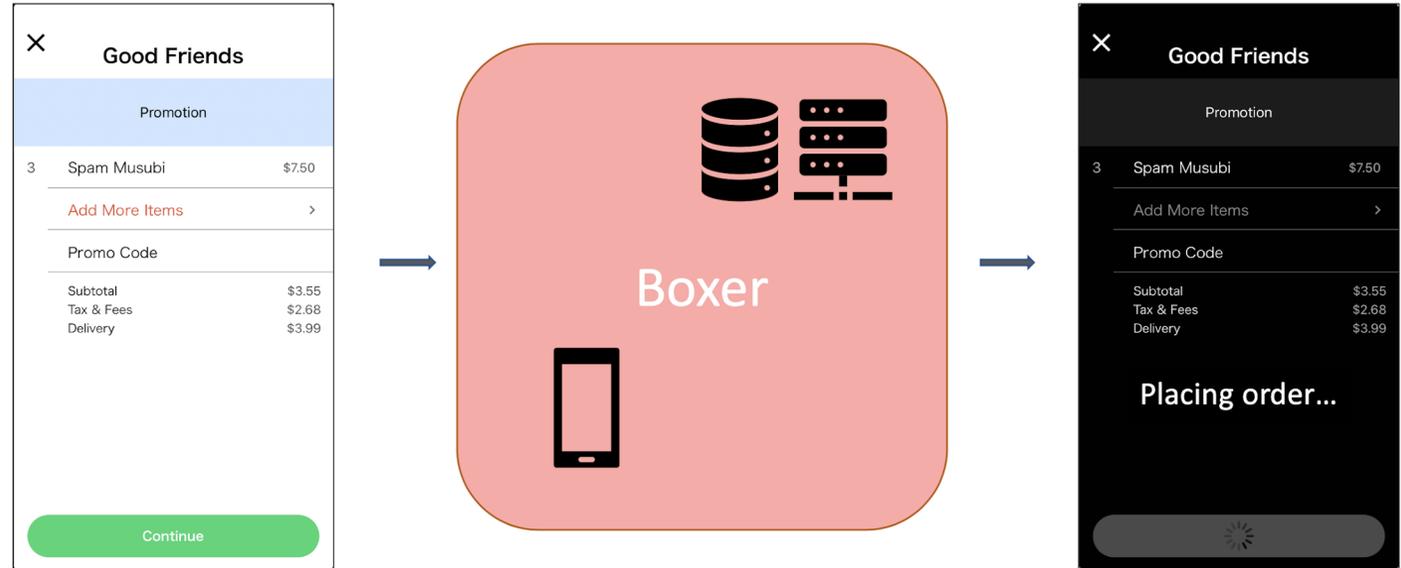
We introduced Boxer, a client-side SDK and server for preventing card-not-present-fraud.



# Conclusions

We introduced Boxer, a client-side SDK and server for preventing card-not-present-fraud.

Boxer combines multiple image analysis techniques with a novel secure counting abstraction to provide a holistic solution to CNP attacks.

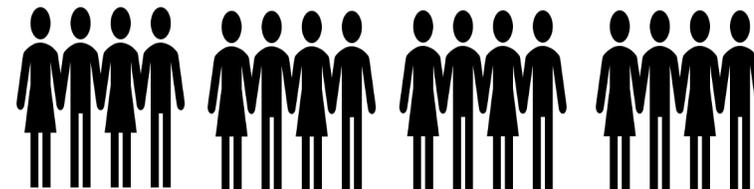
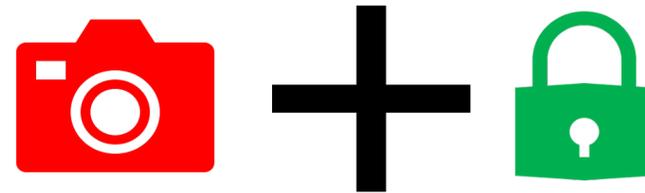
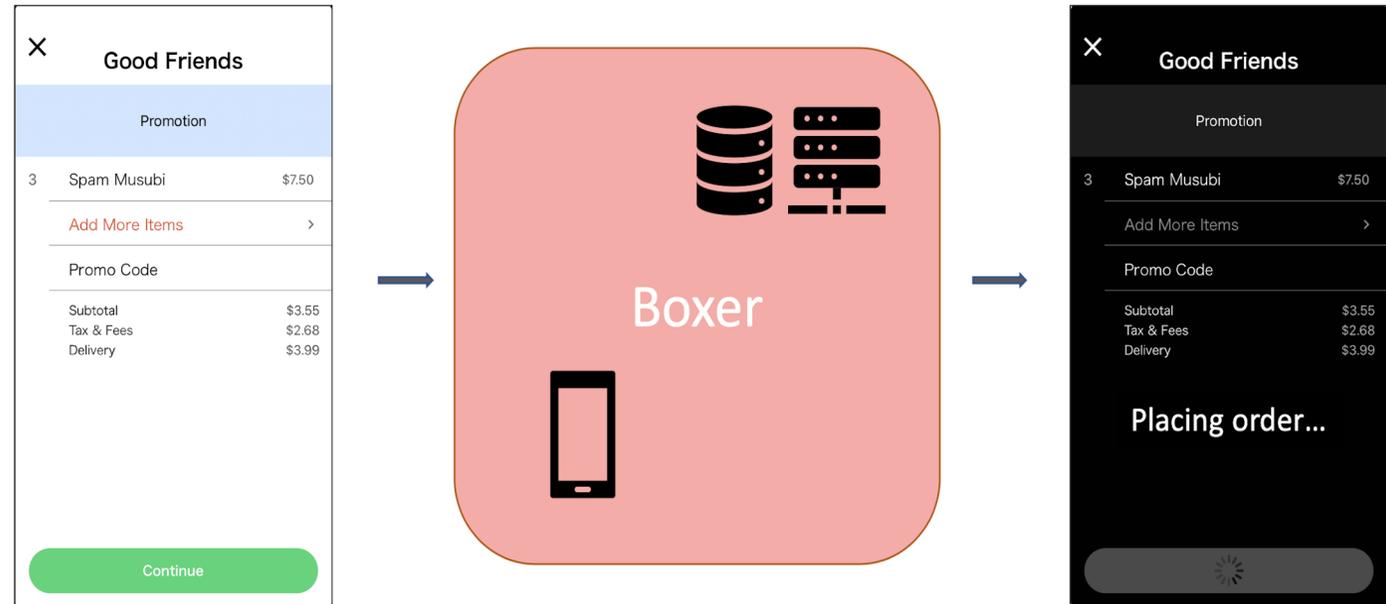


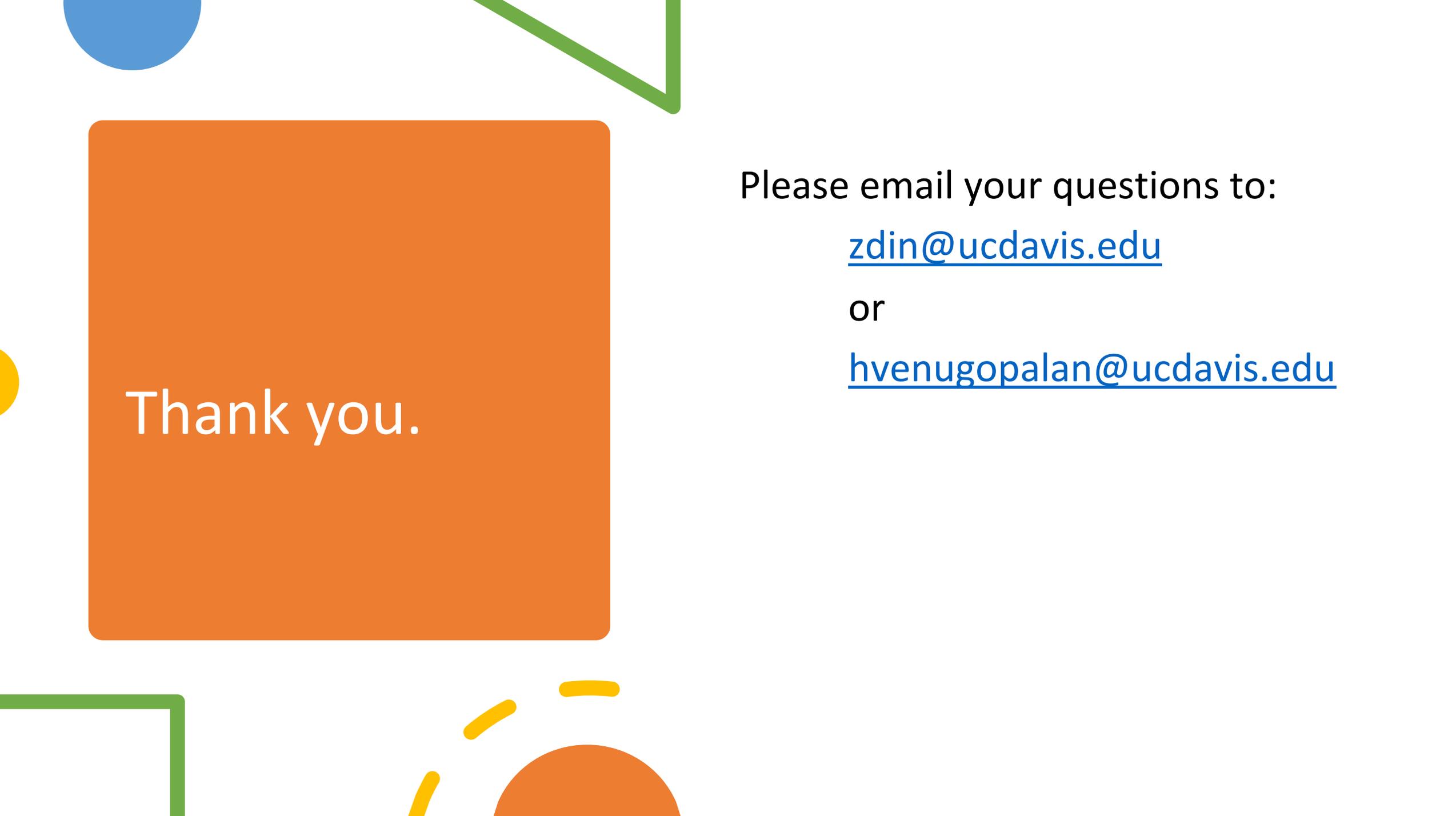
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We introduced Boxer, a client-side SDK and server for preventing card-not-present-fraud.

Boxer combines multiple image analysis techniques with a novel secure counting abstraction to provide a holistic solution to CNP attacks.

Boxer has been integrated into 323 apps. It has scanned 10 millions cards already and is currently actively stopping fraud in production.





Thank you.

Please email your questions to:

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or

[hvenugopalan@ucdavis.edu](mailto:hvenugopalan@ucdavis.edu)