## CERRAS

The Center for Education and Research in Information Assurance and Security

### Natural Language IAS: The Problem of Phishing

Students: Lauren M. Stuart, Gilchan Park. Advisors: Prof. Julia M. Taylor, Prof. Victor Raskin Examples: snippets from actual phishing emails<sup>1</sup>, with Ontological Semantics Technology<sup>2</sup> –based analysis.

#### **Existing Strategies**

Several proposed policies and implemented tools exist for separating likely phishing emails from legitimate emails.

- Blacklists/whitelists for domains and addresses <sup>3</sup>
- Link analysis: target/text mismatch,

#### **Proposed Direction**

Expand the use of linguistic semantics in information security.

 Quantify and/or canonicize *linguistic* and logical hallmarks of phishing emails for detection

Similar methods in stylometric analysis, automatic characterization of network events

#### References

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- http://monkey.org/~jose/wiki/doku.php
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- [4] Garera, S., Provos, N., Chew, M., and Rubin, A. D. A framework for

based approach for detecting phishing pages. SecureComm'07.

features of common bad URLs <sup>4,5</sup>

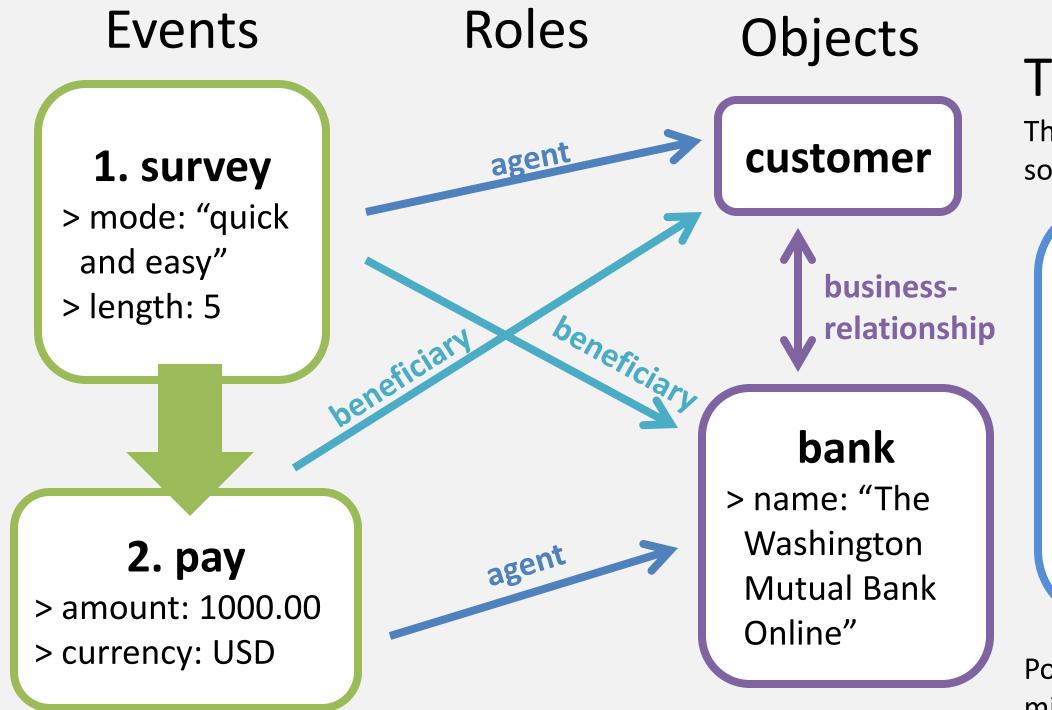
- Language analysis: common keywords, expanded language consideration <sup>5,6,7</sup>
- Visual/DOM analysis: Page elements of fake and real login pages <sup>5,8,9</sup>
- Semantic analysis of message content: comparisons and thresholds
   Ontological Semantic Technology: semantic scripts, text meaning representation, fuzzy logic

detection and measurement of phishing attacks. WORM'07.
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#### Work/Compensation Mismatches

Phishing emails sometimes promise a great deal of money or benefits in return for seemingly little work in order to lure people into divulging sensitive information.

"The Washington Mutual Bank Online department kindly asks you to take part in our quick and easy 5 questions survey. In return we will credit \$1000.00 to your account - Just for your time!"



Triggering Comparison: Scripts

The two events are causally related, and complementary, so they may fit a rule for work-for-reward.

#### script: work-for-reward

- > sequence
- > 1: action
- > 2: compensation
- > consistency requirements
- > complementary roles
- > magnitude(action) ~=
- magnitude(compensation)

Possible candidates for ~= function: human-set threshold, mined threshold,-- but how to express proportionality?

#### Awkward/Unprofessional Phrasing

Automatic Language Usage Analysis

Syntax

Parser

Though many professional, legitimate emails do have grammatical mistakes and awkward phrasing, it may pay to be more skeptical of an "official" communication that does have these mistakes.

"Why you become a PowerSeller?"

"If you agree, please within 24 hours."

#### Inconsistency with Company Policy

Some phishing emails directly contradict publicly-available company policies and can be fact-checked if presented as fact. Checking inconsistency in semantic structures is potentially complicated but one simplification of the idea could look like this:

"You have to click the highlighted fields below and in few days you will become an eBay power seller."

"You don't need to apply for the PowerSeller program. If you qualify, you'll automatically be included." (http://pages.ebay.com/help/sell/sell-powersellers.html)

#### **Jungrammatical** or <30% acceptable

Parser-based verification is subject to false positives when language resources don't have 100% coverage. Non-binary results can give finer-grained control.

grammatical

or >80% acceptable

# script: powerseller status script: powerseller status > sequence > 1: achieve criteria > 2: automatic analysis > 2: issued invitation

- > 3: automatic upgrade
- > implied temporary status?
- > implied permanent status?

> 3: opt in

Comparison against an authoritative source is common; in this case, semantic analysis allows for direct comparison of texts.



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