A Large-Scale Analysis of YouTube Videos Depicting Everyday Thermal Camera Use

## MobileHCI 2018 | September 5<sup>th</sup>

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### Thirty Seconds to Mars MTV Video Music Awards (2017)



# Thermal Cameras

- Thermal cameras (or infrared cameras) detect electromagnetic radiation with lower frequencies than visible light (*i.e.,* infrared frequencies)
- All objects above absolute zero emit infrared radiation, so thermal cameras can 'see' in the dark without external illumination.
- The amount of radiation emitted by an object increases with temperature, so thermal cameras can also measure heat.

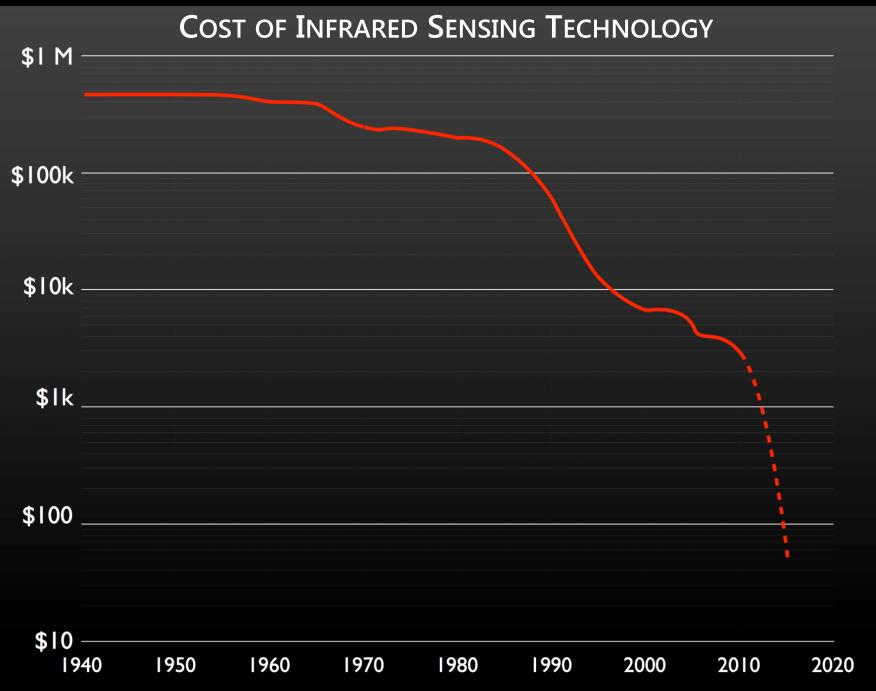
Commercial Cameras

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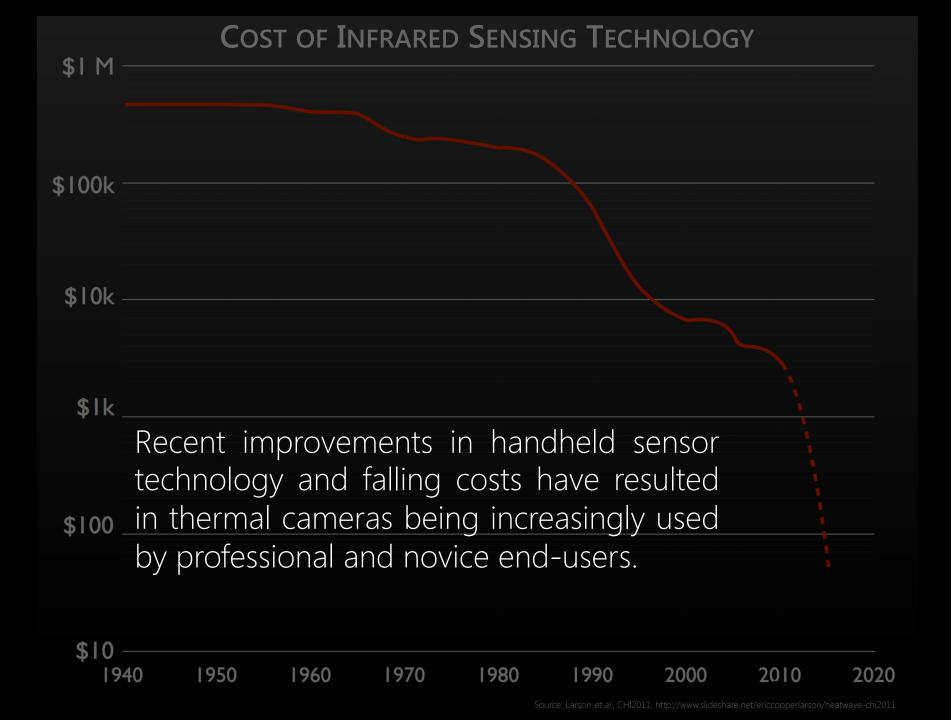
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Source: Larson et al., CHI2011, http://www.slideshare.net/ericcooperlarson/heatwave-chi2011



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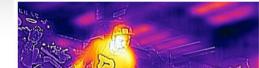
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Boat Beacon uses AIS to show the positions of ships around you when at sea including

view shows the ship positions, a thermal view, and MOB overlaid on the live Camera View.

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disclaims any and all liability that may arise through a third party's use of the App or whether the App will

bearing and distance and closest point of approach (CPA). It also has a Marker button (MOB) which you can use to mark a spot and track its location. Boat Beacon's Augmented Reality

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#### Apps for Android

ena inc.



This application monitors your baby during sleep and raises alarm if he/she is out of rectangular Region of Interest defined by you.



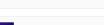
NovaVision utilizes the thermal image processing from the FLIR One to create thermal goggles for the user. The screen is divided in half and each half contains an image view, where the content comes directly from the FLIR One.



Thermal Camera uses the Filr One v2 to display a live infrared image. To achieve this task it uses its own render mechanism, that uses the 14bit raw data from the Filr SDK. Due to the nature of this implementation it can add new features, which are Filr independent.



ThermoVisual Motion Detector (TVMD) is an intelligent, easy to use application that detects thermal and/or visual motion or changes automatically by using FLIR ONE infrared camera.



ompassEye with FLIR

y Electric Pocket

the bearings and compass overlaid.

Remote Thermal Cam f. FLIR ONE

Remate Thermal Cam is a useful Android app that lets you use Your FLIR ONE as a Webcam for Your PC by sending an MJPEG stream to a SmartCam server via WIFL

essional Bearing Compass designed to help navigate at sea and used

much like a pair of Compass Binoculars. When held vertically it shows the real-time camera view with a compass, bearings and artificial horizon overlaid, when flat it shows a real time map centred on where you are with



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A Prof

Thermori-on is a thermal musical instrument, inspired by the "Tenori-on", and using your FUR thermal imaging camera.



With Thermal Paint you can draw areas of the thermal image on top of the aligned visible-light image from the FLIR One. Highlight important areas of an image, or get creative and create unique works of art.



## **Related Work:** Previous Studies of Thermal Camera End-Users

#### Understanding the Role of Thermography in Energy Auditing: Current Practices and the Potential for Automated Solutions

Matthew Louis Mauriello<sup>1</sup>, Leyla Norooz<sup>2</sup>, Jon E. Froehlich<sup>1</sup> Makeability Lab | Human-Computer Interaction Lab (HCIL) Department of Computer Science<sup>1</sup>, College of Information Studies<sup>2</sup> University of Maryland, College Park (matm40), Isylan, jonf(gumd.edu

#### ABSTRACT

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#### Author Keywords

Energy audits; thermography; robotics; formative inquiry; design probes; Sustainable HCI; human-robotic interaction

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#### INTRODUCTION

The building sector accounts for 41% of primary energy consumption in the US, far more than any other sector, and contributes an increasing portion of total carbon dioxide emissions—40% in 2009 compared to 33% in 1980 [46]. One reason for these high emissions is building age. Residential buildings, for example, constitute 95% of all buildings in the US and are on average over 50 years old [51]. Most were constructed using energy inefficient

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Professional Building Thermography Mauriello *et al.* CHI2015

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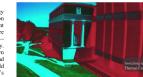


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#### Exploring Novice Approaches to Smartphone-based Thermographic Energy Auditing: A Field Study

Matthew Louis Mauriello<sup>1</sup>, Manaswi Saha<sup>1</sup>, Erica Brown<sup>2</sup>, Jon E. Froehlich Makeability Lab | Human-Computer Interaction Lab Department of Computer Science<sup>1</sup>, Department of Bioengineering<sup>2</sup> University of Maryland, College Park (matth401, manaswi, ebrown 17, joift) (duml.edu

#### ABSTRACT

The recent integration of thermal cameras with commodity smartphones presents an opportunity to engage the public in evaluating energy-efficiency issues in the built environment. However, it is unclear how novice users without professional experience or training approach thermographic energy auditing activities. In this paper, we recruited 10 participants for a four-week field study of enduser behavior exploring novice approaches to semistructured thermographic energy auditing tasks. We analyze thermographic imagery captured by participants as well as weekly surveys and post-study debrief interviews. Our findings suggest that while novice users perceived thermal cameras as useful in identifying energy-efficiency issues in buildings, they struggled with interpretation and confidence. We characterize how novices perform thermographic-based energy auditing, synthesize key challenges, and discuss implications for design

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Improving energy efficiency in the built environment is an important global concern [54]. In the United States, for example, buildings account for 41% of primary energy consumption—more than any other sector—and contribute an increasing portion of carbon dioxide emissions (33% in 1980 vs. 40% in 2009) [38]. To reduce consumption and emission levels, the U.S. Department of Energy (DOE) recommends conducting energy audits to help identify sources of inefficiencies and make recommendations for renovations and retrofits. Home energy audits typically identify improvements that lead to 5-30% reductions in utility use [64]. Energy audit requirements are increasingly becoming part of city legislation [4] and building

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Figure 1: Smartphone-based thermal cameras present an opportunity to engage novice users in thermographic energy auditing activities, which could increase engagement in efficiency initiatives.

certification programs [37,62]. In response, interest in professional energy auditing has increased [35,52].

Professional energy auditors assess buildings using an array of diagnostic tests. With improvements in handheld infrared sensors and falling costs, auditors have been increasingly using thermography during energy audits [5,9,21,42] Thermographic-based energy auditing is a data collection and a visual analytics technique that uses thermal cameras to help detect, diagnose, and document energy issues such as building defects and air leakage that produce thermal signatures (e.g., areas of missing insulation) [47,51]. Prior work has shown that including thermal imagery, or thermograms, in end-user reports positively influences (homeowner) retrofit decisions and conservation behaviors [29,51]. However, despite technological advances, thermographic-based energy audits remain a laborious activity requiring training and expertise [47]. Recently, thermal camera attachments have emerged for

smartphones, which have begun to broaden the adoption of this technology (Figure 1) [70.71]. Marketing materials suggest diverse use, including for DIY energy audits, art and electronics projects, and outdoor recreation (e.g., see [72]). The release of smartphone-based thermal camera attachments—and even fully integrated smartphone thermal cameras [74]—has prompted the development of an increasing number of mobile apps that use and support thermography [22]. While still early, these trends foreshadow a future in which thermal cameras are ubiquitous—integrated into commodity electronics and part of a range of services and applications.

Novice Building Thermography Mauriello *et al.* CHI2017



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Concerns about undertrained practitioners and misconceptions about thermography

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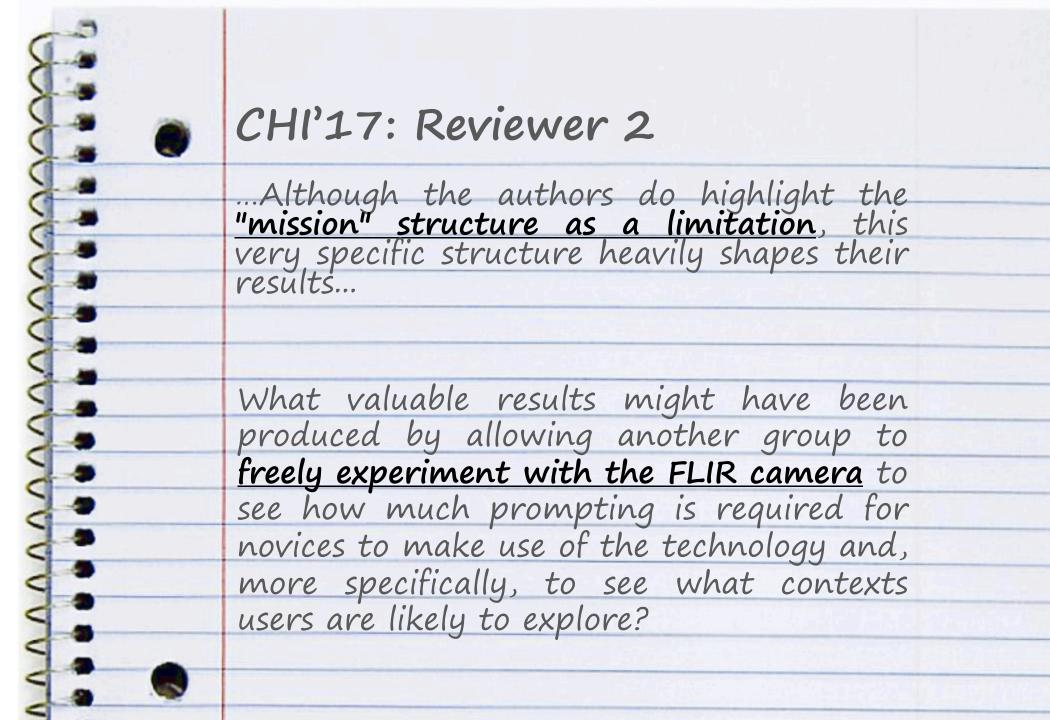
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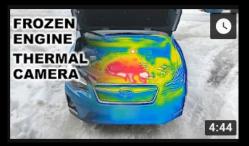
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Challenges interpreting data and being confident in results

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2	Although the authors do highlight the <u>"mission" structure as a limitation</u> , this very specific structure heavily shapes their results
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2	results
>	

















1 What activities do novice end-users of mobile and handheld thermal cameras engage in and why?

2 What level of understanding about the technology is demonstrated?

3 How might these observations inform the design of future thermographic technologies?

water was hiding. 2:11

## **Related Work:** Digital Ethnography via YouTube

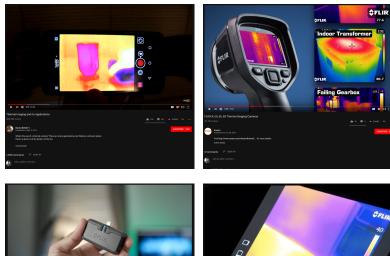
CHI 2009 ~ Personal and Online Information	April 8th, 2009 ~ Boston, MA, USA		CHI 2012, May 5–10, 2012, Austin, Texas, USA	
	Generated Content: the iPhone ouTube			Analyzing User-Generated YouTube Videos to Understand Touchscreen Use by People with Motor Impairments Lisa Anthony YooJin Kim Leah Findlater
Mark Blythe Department of Computer Science University of York mblythe@cs.york.ac.uk	Paul Cairns Department of Computer Science University of York peairns@es.york.ac.uk	-	Together:	UMBC Information Systems College of Information Studies College of Information Studies University of Maryland Baltimore MD 21250 USA College Park MD 20742 USA Inathony@umbc.edu ykim0710@umd.edu College Park MD 20742 USA Ieahkf@umd.edu BESTRACT
HISTING TOTAL OF OFFER YALE VARIAGES OF A STATE OFFER THE ADDRESS OF A STATE OFFER THE ADDRESS OF A	receive thousands of comments providing another source of easily collected data. Such material could provide a rich resource to inform research and design. However, how the quantity and the quality of his material present challenges for using it in a meaningful way. Because the size are dynamic and update easily collected data. We have a second second data way and perhaps unfamiliar methods. The speed of recent technological change has led to almost equally dramatic transformations in the study of HC. There have been turns to fun and enjoyment (e.g. 5), experience design (e.g. 22), cultural or reflective design (e.g. 12), 232 semontic design [e.g. 12] and as whethers [e.g. 6). Each of design (e.g. 22), cultural or reflective design (e.g. 13, 253 semontic design [e.g. 12] and as whethers [e.g. 6). Each of design (e.g. 22), cultural or reflective design (e.g. 6), a set errical studies. Cultural and critical studies have engaged with the problems now confronting HCl for a very long time. Increasing [HCl is finding value in these traditions [e.g. 3, 4, 6, 12, 24, 25]. This paper draws on methods from posts following the lamber of the iPhone 3G on the 11° of July 2008. <b>Phone Street Prescher</b> A stime Apple avoir in b. Mone or bornthely a street prescher. "You people should use your brain more wisely!" the yells "And pead money on something important". [16]. The film is made from within the queues and most of the people seem answed rather than therationed. Sumeon at him, he test is to shut up and move to a different spot to pray and read along from the "Done store the applications. This video is to shut up and move to a different spot of glub 2008. Among gas to recomments posted below the end alut 2008. Among gas to recomments posted below the	Serie Paay   Aalborg University   Serma Lagerlofs Vej 300   9220 Aalborg East, Denmark   jeni@cs.aau.dk   Babbrg University   Setma Lagerlofs Vej 300   9220 Aalborg East, Denmark   jesper Kjeldskov   Aalborg University   Setma Lagerlofs Vej 300   9220 Aalborg East, Denmark   jesper Kjeldskov   Aalborg University   Setma Lagerlofs Vej 300   9220 Aalborg East, Denmark   dubis@cs.aau.dk   Miccoof Research   Y J Thompson Ave   Cambridge CB3 0FB, UK   charberds Gersarch   Y J Thompson Ave   Cambridge CB3 0FB, UK   charberds Gersarch   Y J Thompson Ave   Cambridge CB3 0FB, UK   charberds Gersarch   Y J Thompson Ave   Cambridge CB3 0FB, UK   charberds Gersarch   Y J Thompson Ave   Cambridge CB3 0FB, UK   charberds traberdsmedmall.com	<section-header><section-header><section-header><section-header><section-header><section-header><section-header><section-header><section-header><section-header></section-header></section-header></section-header></section-header></section-header></section-header></section-header></section-header></section-header></section-header>	<text><text><section-header><section-header><section-header><text><text><text><text><text><text><text><text></text></text></text></text></text></text></text></text></section-header></section-header></section-header></text></text>
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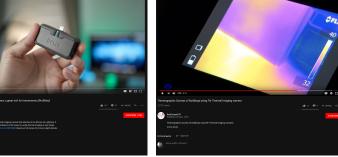
Paay *et al.* 2012

Specific Technology Blythe & Cairns 2009

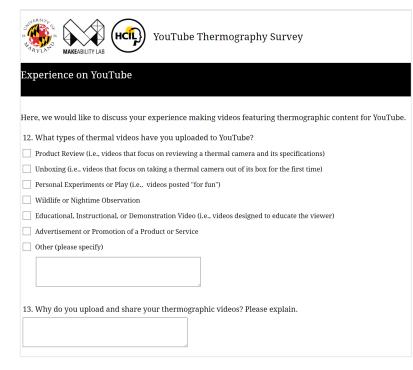
Anthony et al. 2013





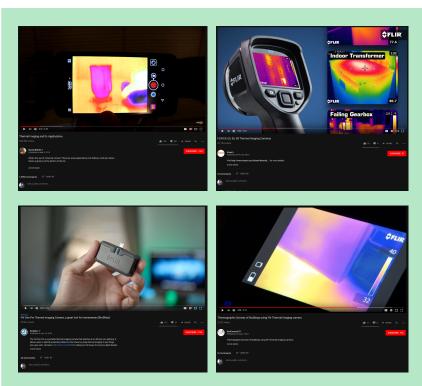


## Part One: Dataset Generation & Qualitative Coding

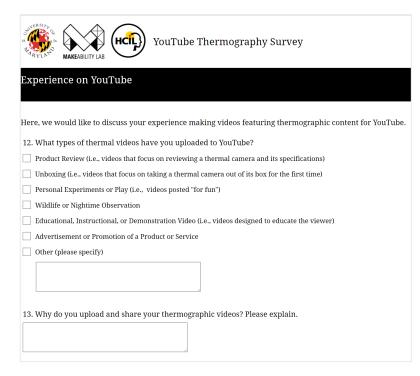


Part Two: Online Survey of Content Creators



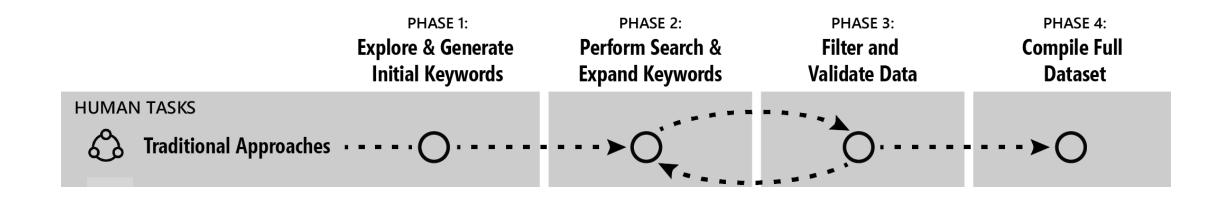


## Part One: Dataset Generation & Qualitative Coding

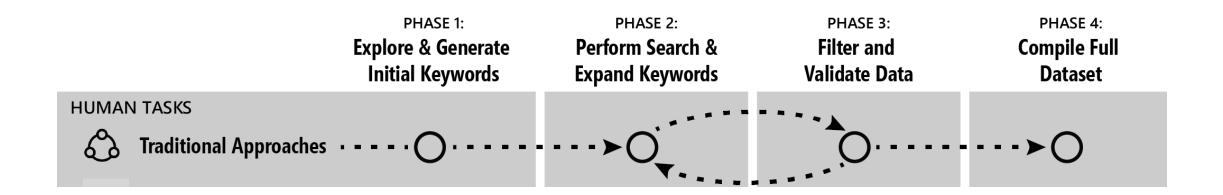


Part Two: Online Survey of Content Creators





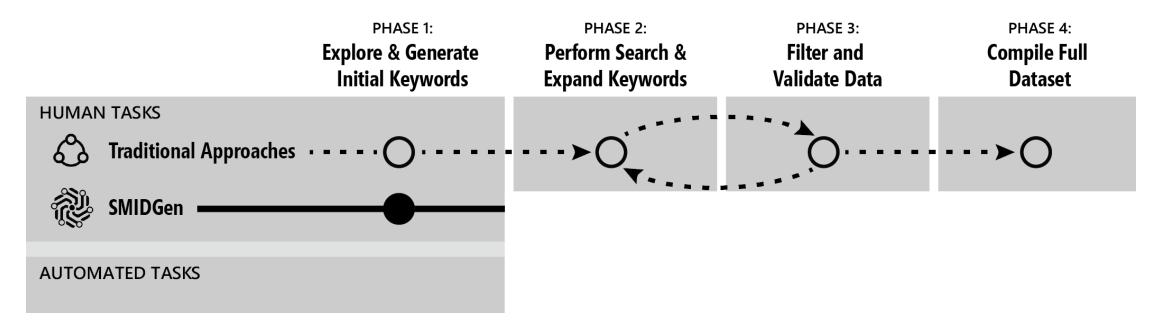




### Problem:

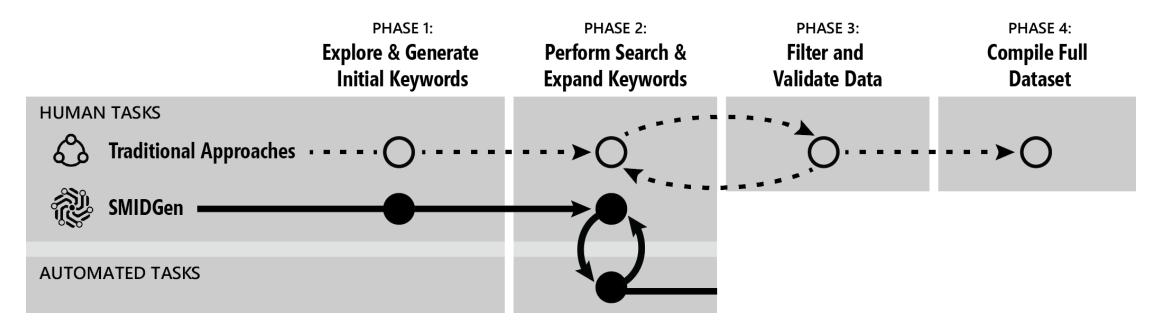
A search for "Thermal Camera" in July of 2017 resulted in over 1 million videos since 2005 compared to the 169 videos that resulted from "Cooking Together" in November of 2010.





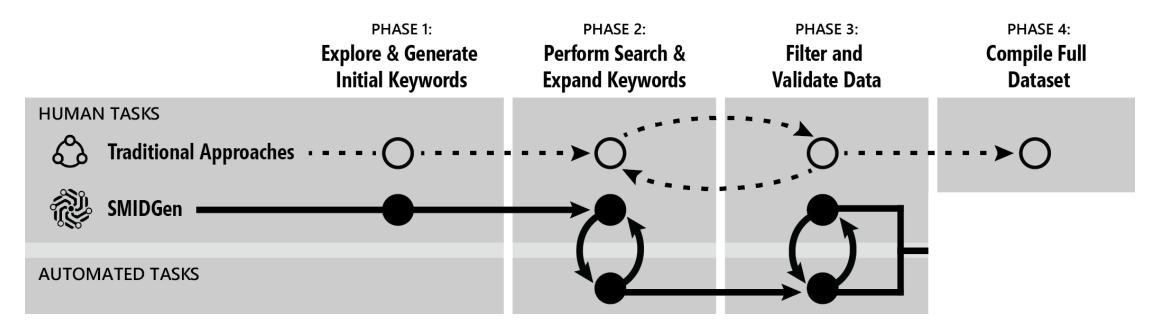
Phase 1: Explore videos on YouTube and generate initial keyword list.





**Phase 2:** Perform searches. Then, apply Kullback-Leibler Divergence (KLD) and Word Co-Occurrence query expansion methods to generate new terms. Perform more searches.





Phase 3: Label a subset of data to train machine learning classifiers for filtering, then infer document labels on unseen videos.



Step	<b>Terms</b> infrared, lepton, thermal, thermal camera, thermal image, thermal imaging, thermography			
Step 1: Initial Keywords				
Step 2: Expanded Keywords	breast thermography, flir lepton, flir one, flir thermal, imaging camera, infrared camera, infrared thermography, night vision, seek thermal, thermal imager			
Step 3: Iterated Codebook	everyday use, product review, news coverage, unboxing, professional demo, advertisement, off topic			

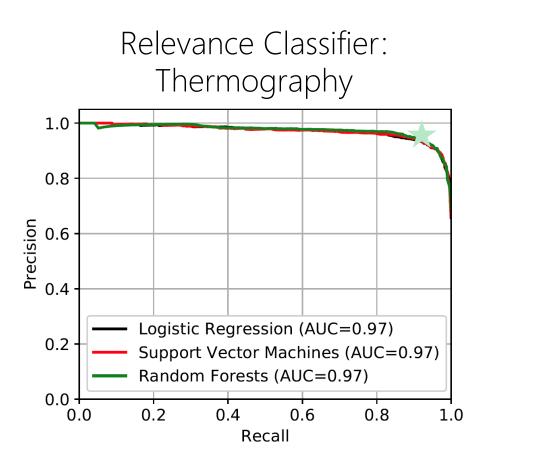
Average IRR across codes in Step 3 was 0.69 (SD=0.09)

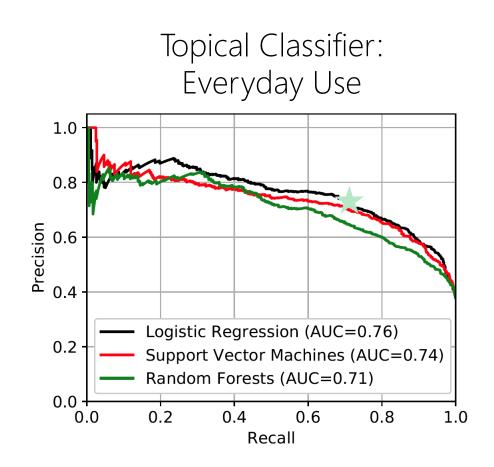


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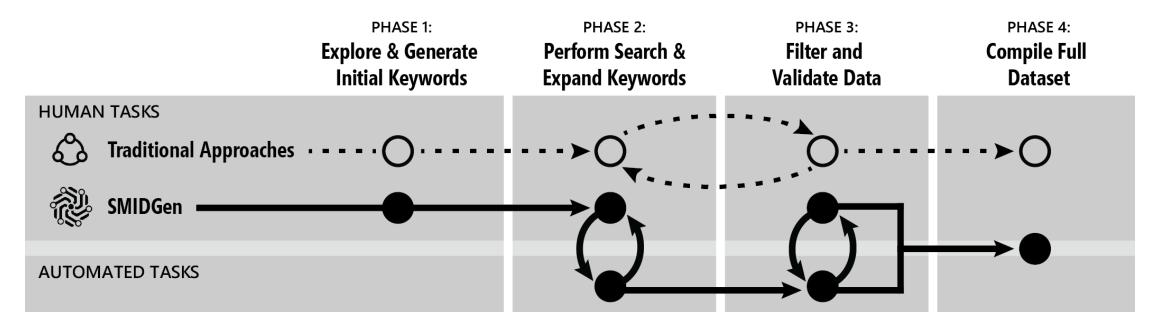
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Phase 4: Randomly sample from resulting dataset.



Topic Codes	Sub-Topic Codes			
Content Areas	Building and Urban Environments, Health and Wellness,			
( <i>N=</i> 10)	Paranormal Investigations, Electronics and Software			
	Projects, Recreational Outdoor Activities and Agriculture,			
	Informal Exploration, Pollution Activism, Vehicles,			
	Research, Security and Emergency Services			
Misconceptions	See Through Objects, Measure Air Temperature, Measure			
( <i>N=</i> 6)	Gases, Faux Filters, Faux Thermal Imagers, Camera Operation			
· · ·	Issues			
Comments Containing Q/A	Content Questions, Technical Specifications, Follow-up			
( <i>N=</i> 4)	Request, Other			

Average IRR of 0.75 (SD=0.27)

## **STUDY METHOD:** DATASET GENERATION

## Additional experiments and methodological decisions:

- How much manual labeling was ٠ required for accurate results?
- How well did query expansion work • to expand the initial dataset?
- What other features might prove • useful for classification?

### SMIDGen: An Approach for Scalable, Mixed-Initiative Dataset Generation from Online Social Networks Matthew Louis Mauriello<sup>1</sup>, Cody Buntain<sup>2</sup>, Brenna McNally<sup>2</sup> Sapna Bagalkotkar<sup>1</sup>, Samuel Kushnir<sup>1</sup>, Jon E. Froehlich<sup>1</sup> Makeability Lab | Human-Computer Interaction Lab (HCIL) Department of Computer Science<sup>1</sup>, College of Information Studies<sup>2</sup> University of Maryland, College Park {mattm401, cbuntain, bmcnally}@umd.edu

### ABSTRACT

Recent qualitative studies have begun using large amounts of Online Social Network (OSN) data to study how users interact with technologies. However, current approaches to dataset generation are manual, time-consuming, and can be difficult to reproduce. To address these issues, we introduce SMIDGen: a hybrid manual + computational approach for enhancing the replicability and scalability of data collection from OSNs to support qualitative research. We demonstrate how the SMIDGen approach integrates information retrieval (IR) and machine learning (ML) with human expertise through a case study focused on the collection of YouTube videos. Our findings show how SMIDGen surfaces data that manual searches might otherwise miss, increases the overall proportion of relevant data collected, and is robust against IR/ML algorithm selection. Author Keywords

Qualitative data collection; mixed-initiative; social media; user-generated content; machine learning; query expansion ACM Classification Keywords H.5.m. Information interfaces and presentation (e.g., HCI):

### INTRODUCTION

Online Social Networks (OSNs) such as Twitter, YouTube, and reddit have emerged as valuable data sources for qualitative studies of everyday interactions with technology [2,3,6,14]. By studying user-generated content, researchers get access to naturalistic data about end-users and populations that are otherwise challenging to observe [16]. However, modern OSNs generate millions of content pieces and hundreds of hours of video every minute [22]. Researchers face challenges related to scale, noise filtering [20], rapidly evolving vocabularies that hinder comprehensive searches [11], and restricted access to proprietary platforms (e.g., rate limits on queries) [10,19].

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Typically, these challenges are addressed through timeintensive manual searches, often costing hundreds of researcher-hours [2,6], or focusing on small, downsampled datasets (e.g., 100 videos [3]) that risk missing insights or misrepresenting a domain or topic.

To assist researchers in constructing OSN-based datasets for large-scale qualitative analysis, we introduce SMIDGen: A Scalable, Mixed-Initiative Dataset Generation approach. SMIDGen combines algorithms in information retrieval (IR) and machine learning (ML) along with a traditional qualitative coding process to assist with data collection and filtering. SMIDGen has four phases: (i) manually exploring an OSN and generating keywords to bootstrap data collection, (ii) computationally expanding these queries to increase domain/topic coverage, (iii) mixed-initiative data labeling and training to construct automated models, and (iv) applying these models at scale to generate a final dataset that is larger and more diverse as a result.

After describing each of these phases, we demonstrate their application and utility through a detailed use case on YouTube: studying non-professional "everyday uses" of thermal cameras. Our findings suggest that the automated query expansion in Phase 2 contributes new data that we would have otherwise missed, and the classification models from Phases 3 and 4 accurately identified domain and topic relevance. We also show that the SMIDGen approach is robust against algorithm selection, which facilitates implementation, and that one need not manually label an entire dataset to achieve performance enhancements. We close with a discussion of SMIDGen and OSN data collection highlighting key strengths, limitations, and suggestions for improving performance.

QUALITATIVE STUDIES OF OSN CONTENT

Research involving data from OSNs generally derives insights from quantitative analyses of word frequencies, network structures, and other measurable artifacts [9,13]. However, recent studies have demonstrated the value of harnessing user-generated content (e.g., videos, images) as a source of naturalistic data for large-scale qualitative research on how end-users interact with

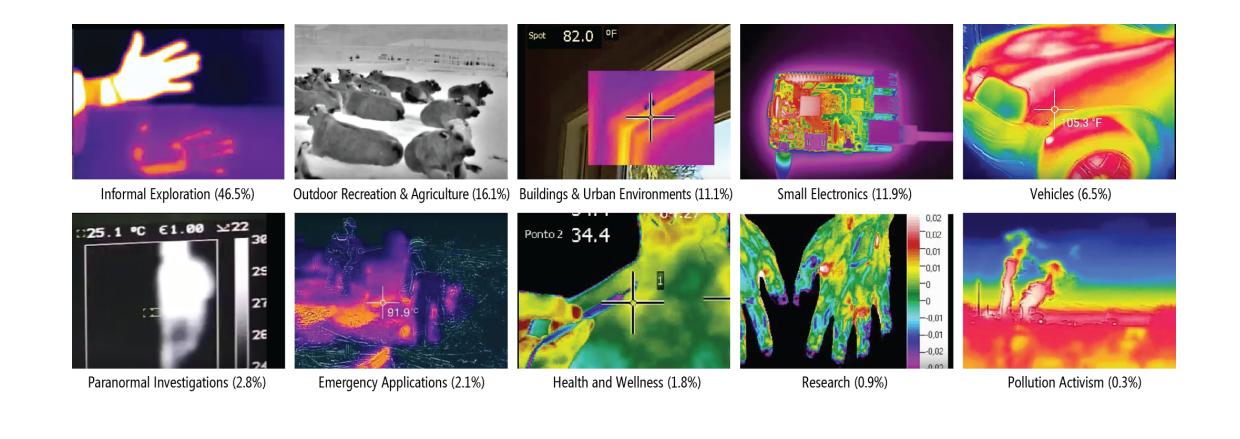


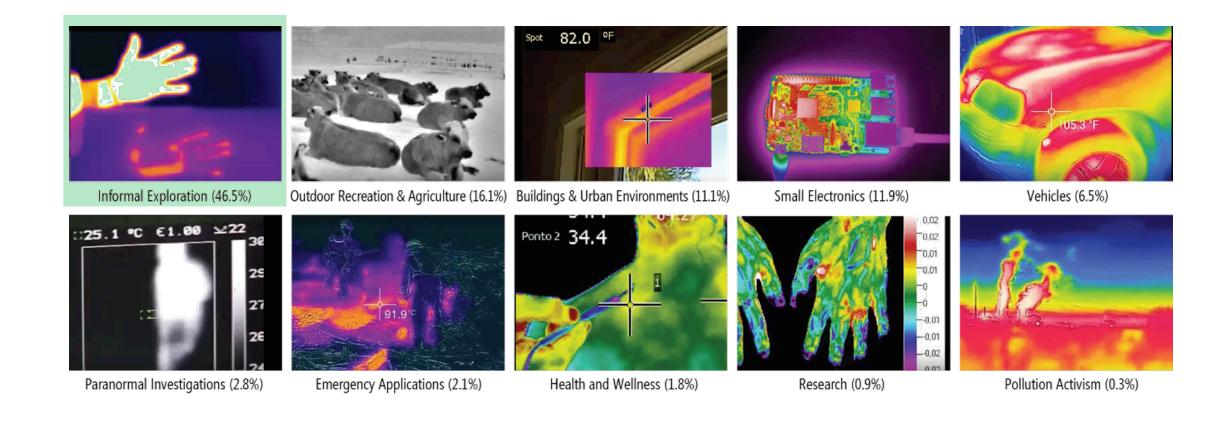
Categories	Dataset (N=675)	Average Duration (SD)	Median Views	Contains Misconceptions	Q&A in Comment
Informal Exploration	46.5% (314)	2.28 (5.11)	507	9.8% (31/314)	27.7% (87/314)
Outdoor Recreation & Agriculture	16.1% (109)	3.24 (7.50)	807	0.9% (38/109)	34.8% (38/109)
Electronic or Software Project	11.9% (80)	3.03 (4.70)	368	1.2% (1/80)	28.7% (23/80)
Buildings and Urban Observations	11.1% (75)	3.06 (4.11)	351	4.0% (3/75)	24.0% (18/75)
Vehicles	6.5% (44)	1.90 (2.48)	822	0.0% (0/44)	27.2% (12/44)
Paranormal Investigations	2.8% (19)	4.30 (4.25)	2327	10.5% (2/19)	63.1% (12/19)
Emergency Applications	2.1% (14)	1.09 (1.05)	637	7.14% (1/14)	28.5% (4/14)
Health and Wellness	1.8% (12)	5.19 (7.49)	2116	0.0% (0/12)	0.3% (4/12)
Research	0.9% (6)	1.02 (0.80)	385	0.0% (0/6)	16.6 (1/6)
Pollution Activism	0.3% (2)	0.34 (0.03)	103	0.0% (0/2)	0.0% (0/2)

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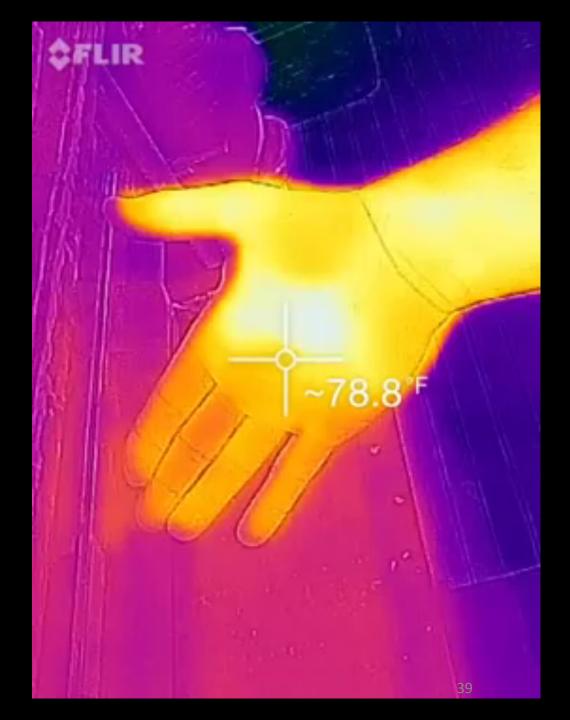


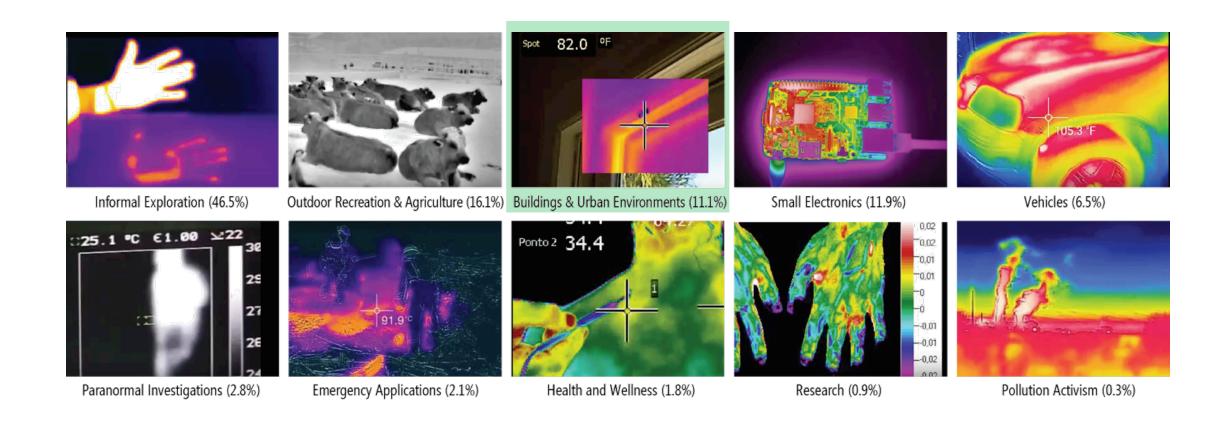
"Can a Thermal Camera See Through water?"

"I'm going to dip my hand down into the aquarium, right into the water, and let's see what happens. I'm going to **calibrate the camera first**.

(Dips hand in aquarium.)

Yeah the surface of the water really reflects the heat away. But we can actually see my hand is heating the very surface of the water. [...] So yeah, the thermal camera doesn't see through water very well, **but it is sensitive enough that you can** actually see my hand warming up the water. **Pretty cool**."





## "DIY Home Energy Audit with an IR Camera"

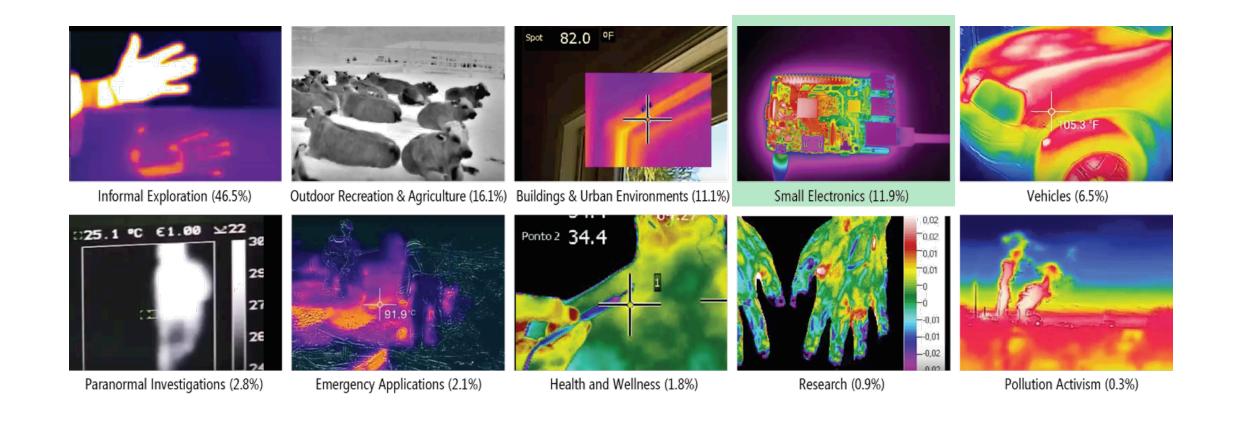
"Now, something of great interest...and these are the types of things that are really cool to discover when you're doing these types of audits.

Here in the ceiling, we can see areas that are significantly warmer than the areas around them. Sometimes this is bleed-through from the heat coming from the windows.

(left corner)

This, however, indicates that the insulation does not cover all the way to the corner of the house. So, we're missing some insulation here."





"Raspberry Pi 3 Heat & TORTURE Test"

"I set up the i7 to compensate for the emissivity for the chip itself as well as the apparent reflective temperature... **this should ensure accurate readings...**"

(Begins stress test)

"The temperature spikes up quite quickly and when it hits the 80°C mark it starts to throttle the speed..."





Only 36 of 675 (5.6%) of videos contained misconceptions about thermography.

- 31% Could image/measure gases (e.g., flatulence)
- 21% Could directly measure air temperature (vs surface temperature)



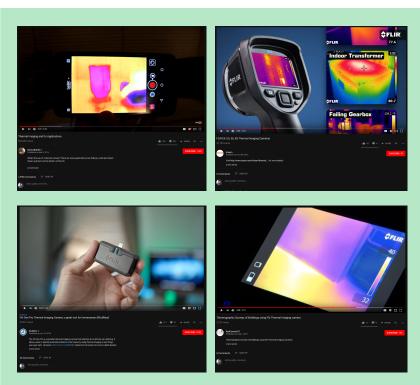
Only 36 of 675 (5.6%) of videos contained misconceptions about thermography.

- 31% Could image/measure gases (e.g., flatulence)
- 21% Could directly measure air temperature (vs surface temperature)
- 14% Could "see through" walls or clothing
- 11% Impact of thermal reflectivity (e.g., making it difficult to image glass)
- 5% How to use specific features

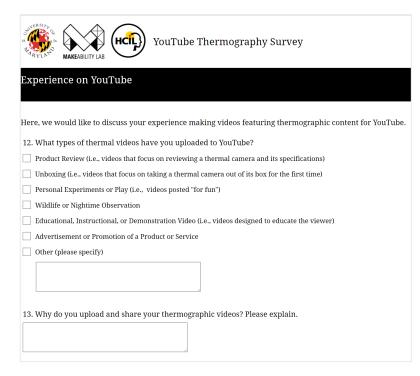


Question Type	Number Asked	Number Answered	Who Responded		
			Original Poster	Other Poster	Both
Technical	41.9%	53.6%	75.6%	12.2%	12.2%
Specification	(153/365)	(82/153)	(62/82)	(10/82)	(10/82)
Content	29.9%	58.7%	62.5%	12.5%	25.0%
	(109/365)	(64/109)	(40/64)	(8/64)	(16/64)
Other	19.5%	71.8%	55.9%	21.6%	22.5%
	(71/365)	(51/71)	(28/51)	(11/51)	(12/51)
Follow-Up	8.8%	50.0%	62.5%	18.7%	18.7%
Request	(32/365)	(16/32)	(10/16)	(3/16)	(3/16)



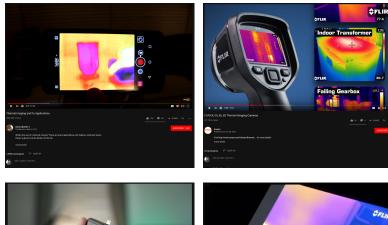


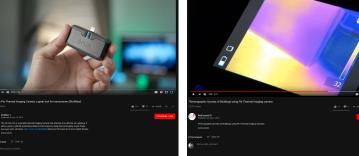
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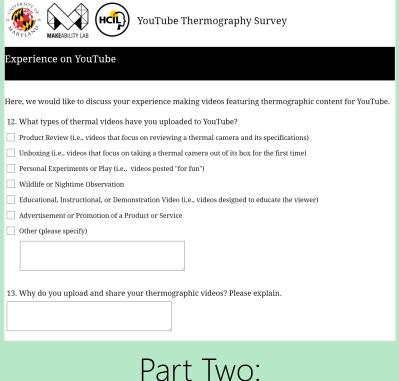
Part Two: Online Survey of Content Creators







#### Part One: Dataset Generation & Qualitative Coding



Part Two: Online Survey of Content Creators



- Content creators with videos in our *n*=1000 random sample were sent requests to participate
- 79 content creators responded (7.7% response rate)
- 48 respondents identified as non-professionals (61%)





#### **Camera Ownership**

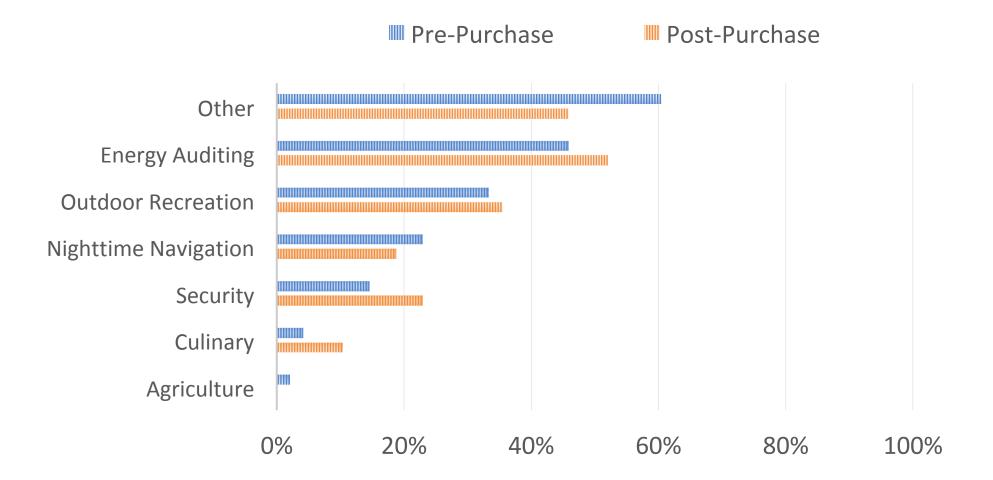
52%

(*N*=25) reported owning smartphone-based thermal camera attachments.

Others reported using:

- Standalone Handhelds (16%)
- Integrated directly with smartphones (4%)

## **Study Findings:** Reasons for Acquiring & Using Thermal Cameras





### **Attitudes on Utility**

97%

(*N=*46) thought their thermal camera was a useful tool that helped them learn and discover.

Most believed they:

- Would continue to use their thermal cameras
- Would continue to post content to YouTube

#### **Reasons for Posting**

# 46%

(*N=22*) posted videos to YouTube to directly engage with the YouTube community about thermal cameras.

Others reported:

- For "Fun"
- Wanting to share with friends and family
- "Because I can"



### **Reactions to Posting**

50%

(*N=24*) reported interacting with other YouTube users online.

Interactions were beneficial in some way:

- Intrinsically valuable
- Good for getting information or feedback
- Exploring new uses





## Like previous work, we found that found that **user-generated videos offered** an otherwise inaccessible **window into user behavior with an emerging technology**.

In particular, **novice users** expressed positive attitudes toward thermal cameras and **performed diverse activities** ranging from imaging pets and beverages to investigating electrical failures and home improvements.

And, contrary to previous work, we found that **users successfully investigated technological limitations and largely correctly interpreted their data**.



- Provide contextually relevant information
- Encourage exploration
- Anticipate and prevent misconceptions
- Enable social supports



- Video analysis is limited to the YouTube community
- Videos in our dataset likely represent the most interested non-professional thermal camera users
- Survey results limited by self-selection bias



- Characterizations of the common thermal camera uses and adoption patterns of novice end-users
- A manual+computational approach to sampling user-generated content from OSNs (specifically YouTube) for qualitative analysis
- Four design recommendations to help promote technical understanding and proper use.

A Large-Scale Analysis of YouTube Videos Depicting Everyday Thermal Camera Use

#### MobileHCI 2018 | September 5<sup>th</sup>

Matthew Louis Mauriello @mattm401

Brenna McNally Cody Buntain Sapna Bagalkotkar Samuel Kushnir Jon E. Froehlich













