## Leveraging Technology to Enhance Dietary Assessment

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DAY OF EXCHANGES BETWEEN ACADEMIC AND INDUSTRIAL ACTORS ON THE EMERGENCE OF INNOVATIVE TECHNOLOGIES

INTERNATIONAL CONFERENCE Tuesday, 21 May 2013 from 9:00 to 18:00 Auditorium Adenauer, Cité Internationale Universitaire, Paris 14, France


## Outline

- Introduction - Why we have to do things better
- Image-based dietary assessment
- Usability testing
- Progress in automated food identification \& volume estimation
- Distribution challenges
- Adaptability advantages


## Examples of energy estimate error based on self-report among adults



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1. Subar et al, 2003. 2. Blanton et al, 2006. 3. Mahabir et al, 2006. 4. Champagne et al, 2002.

## Examples of energy estimate error based on self-report among adolescents



## Commonly underreported foods



## Issues with paper-based methods?

- Burden on the client
- Analysis time for the researcher
- Measurement error


## Image-Based Dietary Assessment

- Convenient \& reduced burden
-study participants
-researchers
- Richer source of information
-a repository of images
-images for future research and analysis
- A tool that will connect with study participants
- Improve accuracy


## Technology Assisted Dietary Assessment (TADA) System Overview



## Multiple Hypothesis Segmentation and Classification (MHSC)



New Set of Segmentation Parameters $\left(\mathrm{Q}_{1,}^{\prime} \mathrm{Q}_{2}^{\prime}, \mathrm{Q}_{3}^{\prime}, \ldots\right)$

## Overview of Volume Estimation Method



DOF = degrees of freedom

## Usability Testing Launching TADA App

- To launch the TADA app, the user can tap on the TADA app icon located on the home screen

technology assisted dietary assessment

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## Record View

- To start recording an eating occasion, the user taps on the Before Eating button to take an image of foods before eating
- After eating, the user taps on After Eating button to take an image of the same scene after eating



## Record: Proper Angle Assistance

- Angle information is obtained from the phone
- Guide colors along with
 words assist the user in taking an image at preferred angles



## Examples of studies using TADA system

- TADA Café
- Controlled conditions
- Men \& women, 21-65 y
-1 to 2 meals
$-\mathrm{n}=57$
- Food in Focus
- Community dwelling
- Men \& women, 21-63 y
- 7 days
$-\mathrm{n}=45$

- Connecting Health and Technology (CHAT)
- Community dwelling
-Men \& women, 18-30 y
- 4 days
$-\mathrm{n}=86$ (of 247)
Daughtery BL et al. JMIR 2012; Kerr DA et al. BMC Public Health 2012


## Remembering to take an image BEFORE or AFTER MEALS was easy.

| Study | Agree | Disagree | Total |
| :---: | :---: | :---: | :---: |
|  | $\longleftarrow \sim \mathrm{n}$ (\%) $\longrightarrow$ |  |  |
| TADA Café |  |  |  |
| Before meals | 52 (91) | 5 (9) | 57 |
| TADA Café |  |  |  |
| After meals | 50 (88) | 7 (12) | 57 |

## Remembering to take an image BEFORE or AFTER SNACKS was easy.

| Study | Agree |  | Disagree | Total |
| :--- | :---: | :---: | :---: | :---: |
|  | $\longleftarrow$ | $\mathrm{n}(\%)$ |  |  |
| TADA Café |  |  |  |  |

# Fiducial Maker: Size and Color Correction 



Cool White


Color Correction


Slide 17

## I think it would be easy to carry and use the fiducial marker.

| Study | Agree | Disagree | Total |  |  |
| :--- | :---: | :---: | :---: | :---: | :---: |
| TADA Café* | $\mathrm{n}(\%) \xrightarrow{*}$ |  |  |  |  |
| After use | $56(98)$ | $1(2)$ | 57 |  |  |

## rEl across time of day quadrants

## Image Pairs Captured Across Time Quadrants

## Proportion of rEl Across Time Quadrants

| Time Quadrant |  |
| :---: | :---: |
| A | $06: 00-10: 59$ |
| B | $11: 00-16: 59$ |
| C | $17: 00-21: 59$ |
| D | $22: 00-05: 59$ |

Schap et al FASEB J March 17, 2011


## Image pairs

 containing commonly underreported foodsAlcoholic beverages*
Coffee*
Cola drink ${ }^{*}$
Candy
Desserts
"Midnight snacks"
Condiments

10:08:41 PM
10:42:22 PM


Before

## Food Items

1. Sausage Links
2. Spaghetti w/ sauce, cheese
3. French dressing
4. Milk, 2\%
5. Cheeseburger sandwich
6. Strawberry jam
7. Orange juice
8. Ketchup
9. Sugar cookie
10. Chocolate cake w/ icing
11. Coke
12. Margarine
13. Toast
14. Sliced peaches
15. Scrambled eggs
16. Pear halves
17. French fries
18. Garlic bread
19. Lettuce salad

Weight error using automated volume analysis by food from images taken by 15 adolescents (11-18 y) during meals over a 24 -hr period

Ratio greater than one, overestimated. Ratio less than one, underestimated.

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## Distribution Challenges

# Review: Viewing a Labeled Eating Occasion 



- The before eating image is displayed in landscape view with colored pins and labels identifying the foods


## Review: Confirm/Remove/Change Food Label


-Users confirm, remove or change labels on food identification pins.
-To correct the food, the user can

choose an item from Suggested
Food or Complete Food List

## Review Process



## MOBILE TELEPHONE TIMELINE



## Mailing devices



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## Cost Considerations

- Mobile telephone
- Data service plans
- Purchase phones
- Device cost
- Monthly voice cost
- Data cost
$\underset{\text { /phone }}{\sim}$
- Distribute and return, or
- Give telephones to participants
- Mobile devices, such as an Apple iPod
- No service plan
- One time device cost
\$275/device +
* \$25/protectors =
\$300 total/device


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