

Mama's Digital Diary: Guided Note-taking for Mothers in Antepartum Care

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Midterm Presentation

Motivation

- **Mothers in antepartum** care usually go through **regular medical sessions** that happens weekly or monthly (i.e., outpatient care).
- However, the patients experience **various symptoms, emotions, and life-impacting events** such as quitting a job.
- Although the experience of an individual patient contains rich information of the patient, they **cannot be reviewed in the regular session** due to lack of medical resources (e.g., time and place)

✂ *This findings are from the domain Interview with 2 doctors and 1 nurse*

Diaries

- **Handwritten diaries** are the most common and widely used medium between patients and doctors
- About **1 out of 5 patients** brings **a long list of questions** in their diary app
- However, the diaries are written in ambiguous language and contain too many information to grasp in a short moment.
 - Ex) I felt pain as if my uterus was **falling out**.

✂ *This findings are from the direct observation of 4 outpatient care sessions (54 cases)*

Proposed Idea: Guided Note-taking

1. **A patient writes a free-form diary** just as they would do with conventional diary application
2. **The app automatically recognizes** the content, **marks** important contents, and **categorizes** it into several aspects
3. **The patient either use** the automatic suggestion **or revise** it, and later utilize it as index to **efficiently navigate the diary data**.

Gathering Target Data

- We developed a simple rule-based **chatbot interface** based on the **domain medical knowledge**
- The chatbot was deployed to real patients, introduced as a “**symptom inquiry**” feature in other experiment with 100 mothers in antepartum care

태동감소	아래 횟수에 체크하세요. 20분 동안 1회 작은 움직임이 감지되었다. 20분 동안 1회의 작은 움직임도 없었다. 추가 20분 동안에도 움직임이 없었다.	정상입니다. 시간이 좀 더 흐른 뒤 태동을 다시 느껴보고 평가하세요. 자세를 바꾸거나 걸어본 후 다시 20분 동안 확인하세요. 분만장으로 내원하세요.
자궁수축/복통	아래 횟수에 체크하세요. 30분에 5회 이상 추가 30분에 5회 이상 아래 강도에 체크하세요. 약간 빠른 정도 꼭꼭 찌르는 양상 생리통과 같은 정도 쥐어짜듯이 아픔 허리를 못 펼 정도의 아픔 허리통증 아래 통증의 부위에 체크하세요. 아랫배 왼쪽배 오른쪽배 윗배	안정을 취하고 수분섭취를 충분히 한 후 다시 30분을 확인하세요. 분만장으로 내원하세요. 관찰합니다. 임신 중 자연스러운 증상입니다. 관찰합니다. 임신 중 자연스러운 증상입니다. 주기적으로 반복되는지 확인하세요. (횟수 질문으로 이동) 분만장으로 내원하세요. 분만장으로 내원하세요. 분만장으로 내원하세요. (강도 질문으로 이동) 변비가 아닌지 확인하세요. (아닌 경우 강도 질문으로 이동) (강도 질문으로 이동) 제하거나 소화과 관련된 증상일 수 있습니다. 임신중독증에서는 간기능이상으로 인한 것이기도 합니다. 분만장으로 문의하세요.
입덧		

Help

iluvobot

Hello. What made you feel uncomfortable?

Bleeding

Discharge

Decreased fetal movement

Contraction / Stomachache

Morning sickness

You

Decreased fetal movement

iluvobot

Check the number of times below

One small movement in 20 minutes

Send

Help

Check the number of times below

One small movement in 20 minutes

No single small movement in 20 minutes

You

No single small movement in 20 minutes

iluvobot

Please watch it for another 20 minutes. Do you feel some movement?

Yes

No

Submit

Send

Failure in the First Attempt

- Although the chatbot was deployed, **nobody used it.**
 - 11 out of 100 patients at least clicked it, and nobody made an inquiry
- Why?
 - It was introduced as an “additional feature” in the experiment that are designed with other purposes
 - The original goal of the experiment was to test the effectiveness of VR feature that visualizes fetus
 - It is highly likely that the patients did not even care about their symptoms, as they expected to use VR features to see their child(ren)

The Second Attempt: Online Community

- There are several **online communities** where patients in antepartum care share their knowledge and experiences.
- Some patients are very **active members** and use the community as their own diary
- We analyzed **the community articles as a *proxy* dataset for mothers' diaries**

Community Dataset

We crawled one major online community and gathered the following dataset

- 22 members
- 1200+ articles
- 10000+ sentences

P8	52	4	I thought it was a secretion like water.
P8	52	5	I'm putting in some vaginal ointment and the mass secretion is coming out.
P8	52	6	I'm living with a liner.
P8	52	7	I felt something coming out, so I went to the bathroom
P8	52	8	and found something wet in the middle of the liner.
P8	52	9	But I don't know if it smells or not.
P8	52	10	I heard some people leak a small amount of amniotic fluid
P8	52	11	Even if there's a small amount, does the amniotic fluid feel different
P8	52	12	and clearly smell like chlorine bleach?

Quantitative Analysis?

- Frequent words using the TF-IDF based method

Baby, Stomach, Hospital, Pregnant, Delivery, Test, Fetal movement, Feeling, Worry, Morning sickness, Husband, Preparation, Pain, Contraction, Injection, Ultrasound, Medicine, Laundry, Menstruation, IVF/ET, Operation

- Topic Modeling with Latent Semantic Indexing (LSI) method

Stomach + Feeling + Lower + Pain + Contraction

Stomach - Baby

Test Tube + Freeze + Pregnant

Blood Test + Test Tube + Pregnant

→ Good to understand overall content of the dataset, but too coarse-grained to develop a working product

Qualitative Analysis: (1) Pilot Study

Content	Codes
Tonight!	-
I'm going to the hospital for cervical cancer screening	Plan
I just got a really small lump of blood.	Symptom, Bleeding
It's pressed like this. Then there's that part.	Symptom
I took a lot of naps ☹☹ I fell asleep	Daily Life
I want to check my sleep time, but I can't sleep.	Symptom, Insomnia
Construction Mat 1.9 cm 3 cm and the difference between noiselessness	-
When would be a good time to re-test for gestational diabetes?	Plan
It's so annoying today	Emotion
Sometimes I can feel it on my side.	Symptom
I didn't count the exact number of times, but I think it did decrease.	Symptom, Fetal Movement
The head size is about 2 weeks bigger than the average size. I'm sad that the baby looks like the groom.	Result
Do you all feel this kind of fetal movement?	Symptom, Question
I have a C-section scheduled for today! I'm scared of a C-section.	Plan

- Randomly sampled 200 out of 10000+ sentences, and conducted open coding process
- Constructed a **conceptual framework** from the codes that explains the types and contents mothers discuss in the community

Conceptual Framework

Contents that mothers in the online community discuss has the following three dimensions

1. Medical Protocol

- a. Plan : Where and when to do what?
- b. Examination : How is the pregnancy going? (w/ measurements as fetal weights)

2. Daily Life

- a. Events: quitting a job, husband, housework, ...
- b. Self-management: workout, medicine, ...

3. Manifestation

- a. Physical → Symptom: bleeding, contraction, accompanying disease, ...
- b. Mental → Emotion: happy, sad, angry, ...

Qualitative Analysis: (2) Closed Coding

	C	D	E	F	G	H	I	J	K	L	M	N	O	P	Q	R	S	T	U	V	W	X	Y
1			1000	1000	1000	1000	1000	1000	1000	1000	1000	1000	1000	1000	1000	1000	1000	1000	1000	1000	1000	1000	1000
912	11																						
913	12		1																				
914	13		1																				
915	14		1																				
916	15		1																				
917	16		1																				
918	17		1																				
919	0					1																	
920	1					1																	
921	2					1																	
922	3																						
923	4		1																				
924	5			1																			
925	6				1																		
926	7					1																	
927	8					1																	
928	9					1																	
929	0		1																				
930	1						1											1					
931	2					1																	
932	3		1																				
933	4																						
934	5																						
935	6			1																			
936	7																						
937	8																						
938	9																						

1000 sentences from all articles of a single author

Further Plan: Proposed App Usage

I haven't slept since 1:30 due to fake pain. On the evening of the 1st, something like water came out. I went to the hospital at 12 p.m. from the 1st to the 2nd. I ran a amniotic fluid test. It wasn't amniotic. The birth canal was 1cm open, fetal movement was good and there was no contractions, so I came home. I had a stomachache at the hospital for a while, maybe because of the internal examination. Two days before (yesterday Wednesday) I didn't even have fake pain. There's been a huge decline in the fetal movement. Very occasionally, less than a minute, it moves a little and then stops? I felt strangely down, so the baby might not be excited either. And then today, at about 1:40 a.m., my stomach started to hurt again. I checked the symptom using the app, and then I lay down around 3:00. It hurts and then it becomes okay, and then it hurts again. I can't get sleep. I don't think it's regular, yet. The application says I'm having a contraction.

Symptom: Contraction / Stomacheache

Symptom: Fetal Movement

Symptom: Discharge / Fluid

Emotion: Anxiety

Examination: Discharge / Fluid

Examination: BC / CL

Examination: Contraction

Management: Self-Check

Auto-tagging → Use as index

Pilot Evaluation: Auto-tagging with SVM

Using the previous coding result, we predicted labels of another author's articles

Symptom: Contraction / Stomacheache

Day 5) Stomachache like menstrual cramps.

I usually have a tummy ball when I'm awake. The belly is a rock...

I've had a stomachache like a menstrual cramps since 3 a.m. today, and my tummy mass periodically lasted about a minute every seven minutes. I didn't go to the hospital because I didn't have a strong stomachache. They say it hurts a lot more if it's a real pain.

Is this a symptom of fake pain?

Question

Is everyone like this at this time?

What kind of pads should I prepare for the baby in late May and early June?

May I prepare some handkerchiefs?

→ Although the recall was very low, the precision was fairly acceptable.

Further Plan: Proposed App Usage

1. Medical Status

Plan

I went to the hospital at 12 p.m. from the 1st to the 2nd.

Examination

I ran a amniotic fluid test. It wasn't amniotic. The birth canal was 1cm open, fetal movement was good and there was no contractions

2. Daily Life

Events

Self-management

I checked the symptom using the app, and then I lay down around 3:00. The application says I'm having a contraction.

3. Manifestation

Symptoms

#contraction I haven't slept since 1:30 due to fake pain. I had a stomachache at the hospital for a while, maybe because of the internal examination. Two days before (yesterday Wednesday) I didn't even have fake pain. And then today, at about 1:40 a.m., my stomach started to hurt again. It hurts and then it becomes okay, and then it hurts again. I don't think it's regular, yet.

#insomnia I can't get sleep.

#discharge On the evening of the 1st, something like water came out.

#fetal_movement There's been a huge decline in the fetal movement. Very occasionally, less than a minute, it moves a little and then stops?

Emotions

#depressed I felt strangely down, so the baby might not be excited either.

Automatic Restructuring → Induce users to re-organize and fill in blanks

Further Plan: Proposed App Usage

Symptom: Weight and Body Shape

PA 28wks

I feel like my stomach has gotten stiff these days.
I felt like my stomach was coming out after the mid-term.
From about 25 weeks? It's been a very different day.
Every day of the week, I feel like I'm changing.
These days, my tummy's been sticking out, I feel like I'm going to explode, and I feel like I'm going to be heavy.

PA 29wks

By the way, I thought my stomach was coming out day by day.

PA 32wks

How's the other mothers doing with the belly coming out?
It's too hard.

PA 36wks

I'm tired of the big stomach, let alone annoying.

Symptom: Breathing

PA 26wks

I had rhinitis, and I got pregnant, and my rhinitis got worse.
Because I can't sleep well, I get asthma when I'm tired
My chest feels stuffy. It's not that I can't breathe. It's frustrating. There's a wheezing sound.

PA 32wks

I'm getting new asthma symptoms. Asthma has got worse after I got pregnant. I went to the university hospital and got an inhaler. Rhinitis is getting worse and asthma is more common than ever. I've already used six inhalers this month. ...

PA 35wks

I'm out of breath after eating again, maybe it's because my stomach is pressed. My heart was beating too fast. (I've been like this once or twice before) I'm so out of breath that when I need to fold the laundry ...

Filtered View : Efficiently explore a number of diary entries

Further Plan: Proposed App Usage

Symptom: Weight and Body Shape

PA 28wks

I feel like my stomach has gotten stiff these days.
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From about 25 weeks? It's been a very different day.
Every day of the week, I feel like I'm changing.
These days, my tummy's been sticking out, I feel like I'm going to explode, and I feel like I'm going to be heavy.

PA 29wks

By the way, I thought my stomach was coming out day by day.

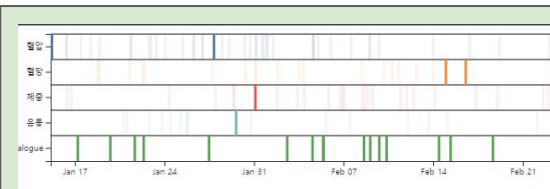
PA 32wks

How's the other mothers doing with the belly coming out?
It's too hard.

PA 36wks

I'm tired of the big stomach, let alone annoying.

Summary Report for Doctors
(i.e., a patient directly shows
it in the outpatient session)



Dedicated Visualization

Join with other field
(e.g., mood change,
body weight)

Project Timeline



Roles and Contribution

All

- Domain Study
- Design Process
- Brainstorming, Searching, Evaluation
- Qualitative Analysis

Seokweon Jung

- Data Preprocessing
- Dashboard prototyping
- Auto-tagging Pilot Evaluation

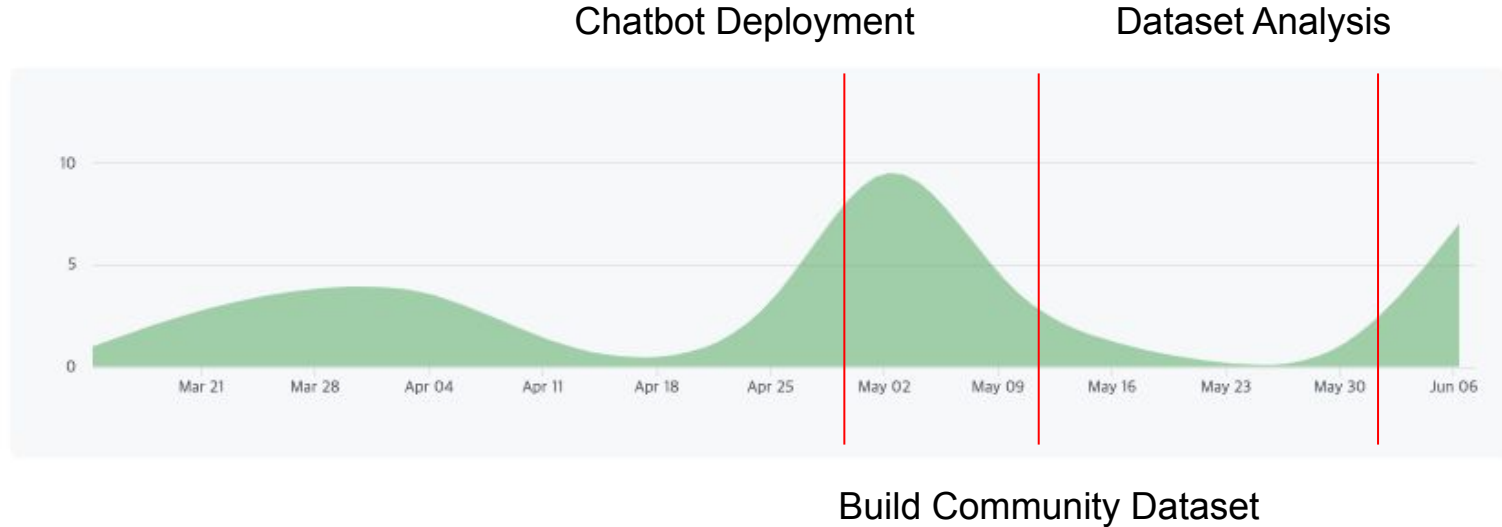
Kiroong Choe

- Chatbot Implementation & Deployment
- Quantitative Analysis
- Target Application Formulation

Aeri Cho

- Data Preprocessing
- Data Collection
- Usage Scenario Articulation

Project management - Git Status



Discussion

- Contribution

- Domain research with several trial and errors
- Conducted qualitative analysis and formulated the target application
- Pilot quantitative analysis and prediction

- Limitation

- Absence of implementation
- Low prediction performance
- Qualitative evaluation needs more iteration

- Opportunities

- Found that a simple TF-IDF based auto-tagging method could work with further sophistication
- Our proposed app can be adopted in real-world medical protocol without additional effort of patients or doctors