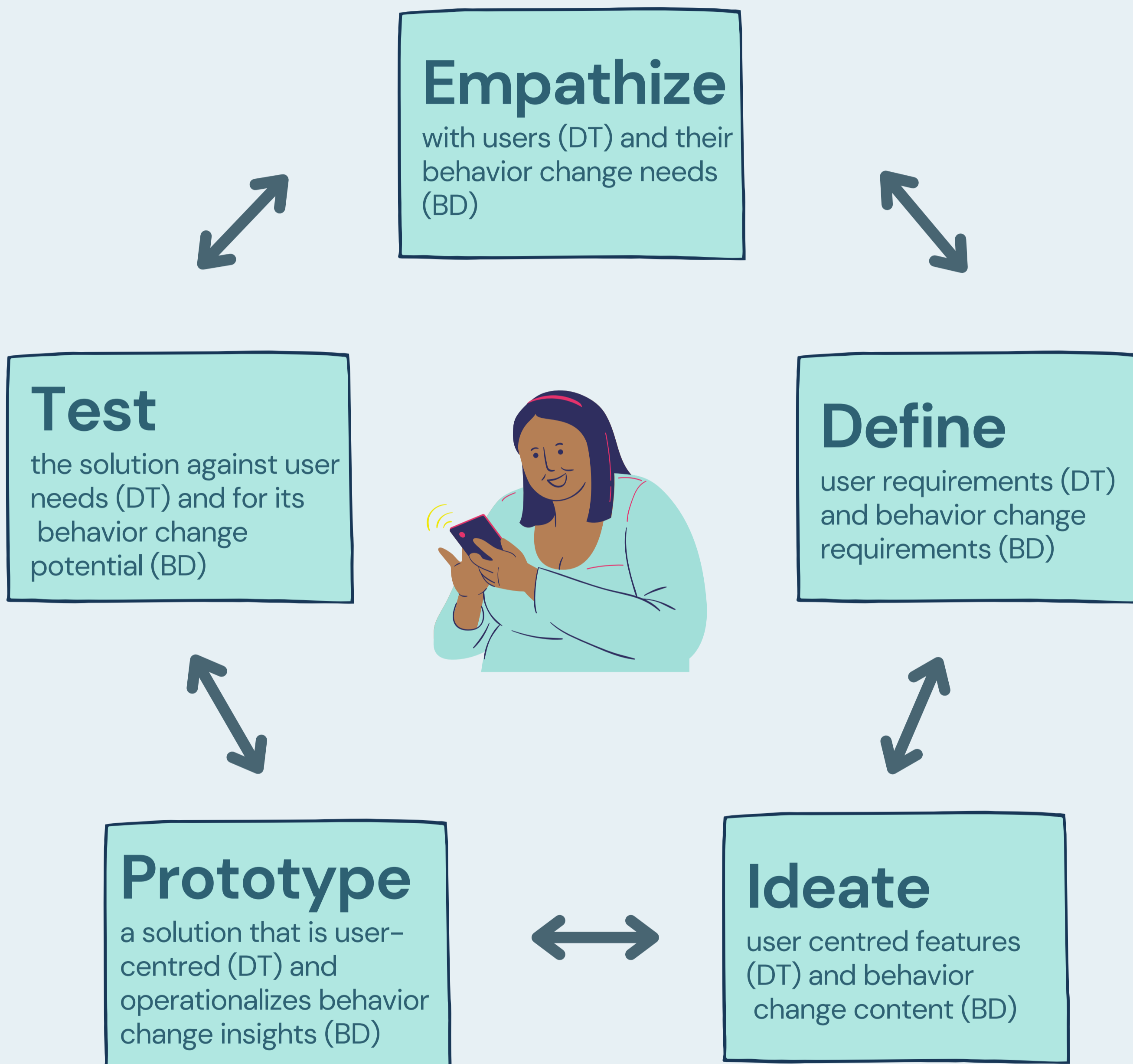


# Behavioral Design Thinking

Integrating methods from Behavioral Design (BD) and Design Thinking (DT) to develop mHealth interventions that more effectively engage users



The Behavioral Design Thinking Approach is based on a review of 75 studies that combined insights from Behavioral Design (BD) and Design Thinking (DT) throughout their mHealth design process [1-75]. The approaches and methods studies used to integrate BD and DT at each stage of the design process are described, along with examples.\*

*\*The five stages outlined below are not meant to be mutually exclusive or followed in a linear fashion. The five stages have been used to organize and make sense of the vast range of methods and approaches available to design teams. The methods and approaches listed are also not meant to be exhaustive of what can be utilized during Behavioral Design Thinking.*

# Empathize

with users and their behavior  
change needs

*Summary of approaches and methods  
from 75 studies [1-75]*

## Methods to empathize



- **Primary Research:** Interviews, focus groups, surveys, workshops
- **Secondary Research:** Literature reviews, secondary data analyses, reviews of mobile applications, reviews of best-practice guidelines

## Who to empathize with



- **End users:** Patients and/or the public
- **Key stakeholders:** Healthcare workers, community partners, behavioral scientists, design scientists, technology developers

## Key Concepts when "Empathizing"

DT



**Understand  
the users**  
who will perform  
the behavior



**Understand  
the behavior**  
that the users  
will perform



BD

- **What are users experiences with** the health issue, health behavior changes, health interventions, mobile applications?
- **What are users' perceptions and beliefs about** the health issue, health behavior changes, health interventions, mobile applications?
- **What are users needs and preferences regarding** future intervention content, intervention features, behaviors to perform, and supports to receive ?

- **What health behavior changes** are most appropriate to target?
- **Which behavioral theories, models, and frameworks** will help conceptualize the behavior change issue?
- **What are the behavioral determinants** (barriers and facilitators) of the target behavior change?
- **What behavior change techniques and strategies** can help address the behavioral determinate?

## Understand the context that the users perform the behavior in

- **What are the current** behavioral norms, healthcare practices, mobile app trends, and healthcare interventions?
- **What factors (personal, social, environmental, structural)** may impact the health issue, behavior change adherence, and/or mobile application usage?
- **What aims and measures (clinical, usage, and behavioral)** are appropriate given the user context?

# Empathize

with users and their behavior  
change needs

*Examples from included studies [44,67,16]*

## *Example 1:*

*A personalized physical activity coaching app for breast cancer survivors: design process and early prototype testing by Monteiro-Guerra et al., 2020 [44]*

Stage 1 of Monteiro-Guerra et al's design process involved "User and Context Research". During this stage, the needs and requirements of breast cancer survivors were empathized with, especially regarding **content, expected benefits, features, and personalization and motivational aspects of the proposed physical activity (PA) tool**. To empathize with users, Monteiro-Guerra et al. performed **(1) a qualitative study with the target users and (2) a review of related literature**. The qualitative study involved a combination of **open-ended questions on PA adherence and technology interest and a slideshow presentation with examples of PA app features to obtain participants' thoughts and opinions** on the featured content. A rapid literature review was performed to complement the findings from the user study on **(1) barriers and facilitators for PA; (2) attitudes, needs, and preferences from breast cancer survivors on PA apps; and (3) information on behavioral theory used in PA interventions for breast cancer**.

## *Example 2:*

*A Smartphone App to Reduce Sugar-Sweetened Beverage Consumption Among Young Adults in Australian Remote Indigenous Communities: Design, Formative Evaluation and User-Testing by Tonkin et al., 2017 [67]*

Stage 1 of Tonkin et al's design process involved "Formative Research". During this stage, Tonkin et al. aimed to **understand potential app features, content, and structure using**: (1) a simulated grocery-selection activity with think aloud (a "think aloud" shop); (2) a semistructured interview regarding eating behaviors; and (3) a questionnaire outlining current smartphone and app use and paper prototyping activity. **The "think aloud" shop activity** was included to collect data related to the determinants of food choice for young adults living in remote Indigenous communities. These data were collected to identify key nutrition features and content for the app. **The semistructured interviews** aimed to collect data related to eating behavior and food attitudes in order to determine approaches to app design to best support behavior change. **The interview schedule was designed using the constructs of the Theory of Planned Behavior (TPB)**. The **Smartphone Use Questionnaire** examined current smartphone and app use to inform foundational app functionality. **The paper prototyping method** directly involved target users in the conceptualization of app features and styling, using trigger materials to encourage participants to build an app prototype.

## *Example 3:*

*Targeting Parents for Childhood Weight Management: Development of a Theory-Driven and User-Centered Healthy Eating App by Curtis et al., 2015 [16]*

Stage 1 of Curtis et al's design process involved "Understanding the Problem and User Preferences". **First, Curtis et al. defined the program in behavioral terms while taking the context into account**. They did this by completing an extensive review of the evidence on behaviors to address childhood weight management. **Second, Curtis et al selected the target behavior for the app to address**. They did this by conducting empirical research with the target population and consulted a paediatrician, dietician, two public health experts, and a family weight management service specialist about activities currently done and where the app could add value. **Third, Curtis et al. attempted to understand both the target behavior and user preferences** by conducting a qualitative study to address BCW and UCD methodologies. The study helped to understand barriers and facilitators to parents' capability, opportunity, and motivation in enacting the target behavior, as well as to explore parents' preferences for app features. The qualitative research involved conducting 6 focus groups, one with family weight management case workers and five with parents.

# Define

the user and behavior change requirements

*Summary of approaches and methods from 75 studies [1-75]*

Methods to "define"



- **Researcher synthesis** (i.e., research team makes sense of results)
- **Expert consensus** (i.e., clinical, technology and behavioral experts)
- **User prioritization** (i.e., patients and/or the public)

## Key concepts to "Define"

DT

### "User Requirements"



Define user centred requirements by analyzing and sorting user experiences and preferences into key themes and sub-themes.

#### Organization of Requirements

- Organize requirements by **shared** user beliefs & needs
- Create **user stories, journeys and scenarios**
- Translate user requirements into "**knowledge seeking questions**" for future ideation



### "Behavioral Requirements"



Make a "behavioral diagnosis" by analyzing empathy results, referring to constructs of a behavioral theory or model (e.g., COM-B).

#### Organization of Requirements

- Organize requirements by **behavioral determinants** that need to be addressed (e.g., motivation)
- **Select a behavioral model** to guide future design
- Translate requirements into a **logic model** that clarifies relevant behavioral outcomes, objectives and determinants



### mHealth Specific Considerations

- Organize requirements by their **potential location in the mHealth application**
- Clarify whether requirements will be **structure or feature based** (structures are the technical elements to deliver the features)

Refine requirements list



- Identify requirements within the **project scope and objectives**
- Use **feasibility criteria** to refine and select certain requirements
- **Consult experts and patient/ public users** to prioritize the requirements
- **Rank requirements** according to their (a) likelihood elicit behavior change, (b) alignment with current practices and guidelines, (c) adaptability to a digital interface, (d) acceptability to users, and (e) compatibility with data collection needs.

# Define

the user and behavior change requirements

*Examples from included studies [65,39,34,58]*

## Example 1:

***Iterative four-phase development of a theory-based digital behavior change intervention to reduce occupational sedentary behavior by Stephenson et al., 2020 [65]***

Stage 2 of Stephenson et al's design process involved **consensus workshops to amalgamate and discuss the findings of phase 1** (which included a systematic review, user focus groups and review of behavior change strategies), **gain expert opinion, and draw upon evidence from current literature. Mind-mapping** helped members define the requirements of the DBCI. **The APEASE criteria** (Acceptability, Practicability, Effectiveness and cost-effectiveness, Affordability, Safety/side-effects, Equity) helped members make sessions about which technology strategy would be most appropriate. The final selection of required intervention functions was informed by referring to (a) **the BCW framework to make a 'behavioral diagnosis'** (b) **existing apps and app features**, (c) **expert consensus on 'best bets'** based on previous findings from phase 1, and (d) **expert advice on feasibility in terms of computer programming.**

## Example 2:

**Co-Design of a Consultation Audio-Recording Mobile App for People With Cancer: The SecondEars App by Lipson-Smith et al., 2019 [39]**

Lipson-Smith et al. relied on **iterative co-design methods the define and refine system requirements.** Co-design workshop attendees **continuously added to and refined a list of functions the app should be able to do.** Attendees helped craft key **'knowledge-seeking questions'** that would be used during ideation. **Journey Mapping** was also used to map out the pattern of use for the app in the context of the patients' journey. Workshop attendees then used **MoSCoW Methods to prioritize the apps 'must haves', 'should haves', 'could haves' and 'wont haves'** to reach a common understanding **on the scope of the project and the importance of previously brainstormed requirements.**

## Example 3:

**A Culturally Relevant Smartphone-Delivered Physical Activity Intervention for African American Women: Development and Initial Usability Tests of Smart Walk by Joseph et al., 2020 [34]**

To analyze user focus group data (from Phase 1), Joseph et al. **created a codebook of primary deductive codes based on the five Social Cognitive Theory (SCT) constructs** (Behavioral Capacity, Outcome Expectations, Self-Efficacy, Social Support, and Self-Regulation). Secondary codes consisted of key concepts examined under each SCT construct. Joseph et al reviewed the coded data for repetitive themes within and across the specific SCT constructs. A local community member of the research team also reviewed the results. **Joseph et al presented findings according to the salient constructs of SCT, and outlined implications for how the findings could be translated and integrated into the design of Smart Walk.** The results also served to **clarify exactly how cultural norms and preferences of women** could be incorporated into the intervention design and delivery.

## Example 4:

**Development of a Smartphone Program to Support Adherence to Oral Chemotherapy in People with Cancer by Ross et al., 2019 [58]**

Stage 2 of Ross et al's design process involved **clearly defining the technical features and structure of the smartphone program.** The selection of the **smartphone program's technical features and structure** was informed by findings from the **formative study** and a literature review (conducted by the research team) . The research team made sure to clearly define the **technical characteristics of the intervention** (eg, the platform used to deliver the strategies, personalization of the strategies) and **the frequency and conditions of intervention delivery** (eg, frequency of medication reminders) at this stage.

# Ideate

## user-centred features and behavior change content

Summary of approaches and methods from 75 studies [1-75]

### Methods to "Ideate"



- **Researcher ideation** (i.e., researchers propose content and features)
- **Stakeholder workshops** (i.e., multidisciplinary team brainstorming)
- **Technology partner guidance** (i.e., app developers specify operationalization)
- **Patient/public engagement** (i.e., patient co-design and creative ideation)

### Key approaches when "Ideating"



#### "Behavioral Mapping"

A structured, evidence-based approach to identify behavior change content

1. **Select** BCTs according to the behavioral diagnosis (e.g., utilize Michie's BCT Taxonomy)
2. **Identify** any additional behavioral "nudges" that look promising from other sources.
3. **Translate** BCTs and nudges into potential mHealth content and features
4. **Reflect** on how other applications have translated BCTs into mHealth features
5. **Refine** BCTs and nudges using feasibility criteria such as APEASE

BD

#### Research-Led Ideation

- Researchers can create **mixed tables** to consider how behavior change insights and user preferences can both be translated into design themes and functionalities.
- Researchers can refer to a **"guiding principles"** document to reflect on how user requirements can be made compatible with the target behavior, theory, and a digital format.
- **Researchers can use their expertise** to reflect on how behavior change insights may be integrated with existing programs, practices and norms, as well as with best evidence from mHealth design and clinical innovation.



#### Technology-Partner Guidance

- **Technology partners can help iteratively ideate** and specify how behavioral and user requirements can be feasibility operationalized within an mHealth app (including design, functions, features and flows).
- **Tools such as the BIT model, PSD framework and/or Nielsen's Heuristics** can be used to guide the translation of behavioral and user requirements into technical elements for the program.

BD+DT



#### Patient and Public Engagement

- **Co-designing** with patients/ the public can help ensure **behavior change insights** are user friendly.
- Getting patients/ the public to **rank, prioritize and conceptualize** how behavioral insights should be operationalized to meet their own needs.
- **Utilize visual and creative methods** to help users reflect on app ideas, content, and design.
- **Utilize "user personas"** to guide ideation, constantly checking if behavior change insights are accounted for (and to discuss their potential integration if not addressed)
- **Utilize "solution inspiration" and "whiteboarding"** to structure how the app could be built.

#### Multidisciplinary Stakeholder Workshops

- **Group discussion** about most important behavior change insights and strategies (including application content dose, delivery, and organization) suitable for the target population, a mobile app and behavior change objectives.
- **Brainstorm personalization and tailoring strategies** to deliver specific behavior change, user-centred and clinically relevant content.

# Ideate

## user-centred features and behavior change content

*Examples from included studies*  
[47,27,49]

### Example 1:

**Iterative development of Vegethon: a theory-based mobile app intervention to increase vegetable consumption by Mummah et al., 2016 [47]**

**After potential behavioral strategies were identified** (from a literature review of behavior change strategies), **a multidisciplinary team engaged in a series of group brainstorming sessions**, also known as ideation, to conceive of **creative ways in which these techniques might be implemented**. Brainstorming centered around potential mobile app features and was inspired by a collection of **highly rated apps on the App Store**. A multidisciplinary team enabled the ideation of a wide range of diverse ideas **taking behavioral theory, user insights, and product experience into account**.

### Example 2:

**The development of Drink Less: an alcohol reduction smartphone app for excessive drinkers by Garnett et al., 2019 [27]**

Garnett et al. translated specified intervention requirements into app modules. **First, BCTs targeting salient behavior constructs** were selected by the research team using a mapping approach guided by the BCT Taxonomy Version 1. **Second, the research team used PowerPoint slides** to describe how each intervention component could be translated into an app module (in terms of the text, graphics, and functionality) to the app developers. **The intervention components were translated into potential app modules in close collaboration with expert and experienced app developers**. Regular discussions between members of the research team and the developers were conducted to ensure that the description provided of the intervention components was translated in ways that were **feasible for users (judged by the app developers) and met the initial specification (judged by the research team)**.

### Example 3:

**Development of an Intervention to Increase Sexual Health Service Uptake by Young People by Newby et al., 2019 [49]**

**First, behavior change techniques (BCTs) suitable** for targeting the selected determinants were identified using the Behavior Change Wheel and BCT Taxonomy. The most appropriate BCTs for each determinant were chosen, excluding those that were either unfeasible given the digital mode of delivery or irrelevant to the target behavior. **Second, based on the system requirements and list of BCTs, ideas for the look, feel, and functionality of the app were developed by the steering group** (health psychologists, a public health consultant, a project manager, two young people, and a design lead) **and the Young People's Partnership Board (YPPB)** (group of end users). Over a period of 3 months, the steering group, the YPPB, and the design agency worked together to develop practical strategies (what users of the intervention would see and do) to deliver BCTs. This was a creative and iterative process. **All ideas were judged according to their feasibility and ability to effectively deliver the BCT**. The ability of the proposed ideas to engage the priority population was discussed among the YPPB. The steering group and YPPB made the final decision about which practical strategies should be used based on the above criteria.

# Prototype

a solution that is user-centred and supports health behavior change

*Summary of approaches and methods from 75 studies [1-75]*

## Methods to "Prototype"



- **Select a Prototyping "Approach"** (e.g., iterative rapid prototyping)
- **Utilize Prototyping "Tools"** (e.g., application flow charts and wire framing)
- **Consider a Prototyping "Aid"** (e.g., Persuasive System Design framework)

## Key Prototyping Approaches



DT

### Design Thinking Approach

Iterative prototyping, feedback and refinement (e.g., using sprint, scrum and agile methods)



### Behavioral Design Considerations

**Co-Development of BCTs:** Users and key stakeholders can help clarify what (content), when (frequency), how many (dose), who (target user) and which (medium type) BCTs should be delivered. Co-development can also help create more appropriate questions to personalize application content (to deliver unique behavioral, clinical and user-centred content).

**Develop an Intervention Plan:** Developing an "Intervention Plan" can help clarify the reasons behind the ideated content (i.e., behavioral and user-centred linkages) which may help ensure BCTs and user preferences are not lost in translation during technological development.

BD

## Key Prototyping Tools



### Design Thinking Tools

Wire framing, paper prototyping, rapid mock-ups, system architecture diagrams, app flow charts, user stories, and use case scenarios.



### Behavioral Design Considerations

**BCT Flow Charts:** Map out how the BCTs will be interacted within the proposed prototype.

**User Stories organized by Target Behavior Changes:** Organize user stories by the target behavior changes to be achieved to ensure the solution meets relevant behavioral requirements.

## Key Prototyping Aids



### Design Thinking Aids

Usability Heuristics, Eight Golden Rules, Human Interface Guidelines



### Behavioral Design Considerations

**Use the PSD Framework, BIT Model or Computer Tailoring Method:** Using a behaviorally-informed technology development framework or model can help guide the translation of behavioral insights into operationalized features and functions within a prototype.



# Prototype

a solution that is user-centred and supports behavior change

*Examples from included studies [69,16,64,68]*

## Example 1:

**Using codesign to develop a culturally tailored, behavior change mHealth intervention for indigenous and other priority communities: A case study in New Zealand by Verbiest et al., 2018 [69]**

Prototyping was an iterative process for Verbiest et al., with regular feedback and consensus meetings. The app developer took the high level of input from the community focus groups and worked with the multidisciplinary research team to create several wireframe prototypes of the mHealth tool. **Incorporating BCTs into mHealth intervention was an iterative process founded on community based co-design.** Through the co-design and early prototyping, it became evident that despite community partners having similar ideas with regard to BCTs, there were clear differences with regard to the content of them and how they would be delivered. Communities provided feedback on the wireframes and broad consensus was reached regarding content, features, and functionalities (i.e., not everything could be adopted due to reasons such as time and technology constraints).

## Example 2:

**Targeting Parents for Childhood Weight Management: Development of a Theory-Driven and User-Centered Healthy Eating App by Curtis et al., 2015 [16]**

After deciding what BCTs to include, Curtis et al aimed to **embed these BCTs into an actual app** informed by user preferences. **Consulting with the app company facilitated** the process of how BCTs identified in previous steps could be meaningfully combined with findings on user preferences **to create app features.** Consultations with a software engineer led to the development of a **"Flow Chart" to map specific BCTs to app features,** showing the sequence of how BCTs would be delivered to parents. The diagram was further refined through parental feedback. **With respect to enhancing user experience and engagement in the application,** parents' preferences for app features were combined with suggestions from the app company. For example, progress bars, achievement badges, and points were identified as a way of providing feedback for parents on their children's eating behavior.

## Example 3:

**The Design and Development of a Personalized Leisure Time Physical Activity Application Based on Behavior Change Theories, End-User Perceptions, and Principles From Empirical Data Mining by Sporrel et al., 2021 [64]**

Sporrel et al. outlined that while some frameworks provide a step-wise instruction to develop an mHealth intervention (e.g., IDEAS framework) others provide guidance for specific steps such as the translation of behavioral theories to persuasive strategies delivered within an app (e.g., BIT model). Sporrel et al. used the **BIT model to guide the practical implementation and design** of the persuasive strategies in the app. Specifically, the BIT model helped to describe **what intervention modules the user receives** (e.g., notifications), **how it relates to the persuasive strategies** (e.g., reminders), **when they have access to the module** (e.g., under which condition), and **how the modules look like** (e.g., complexity and aesthetics). The team outlined these conditions by **creating "User Stories"** with stakeholders, behavioral scientists, computer scientists, and the app developer. The "user stories" served to translate the requirements into the app modules, as **they explain the technical implementation and design characteristics of the selected persuasive strategy** (e.g., "As a user, I want to restrict the amount of messages I receive during the week, so I do not get disturbed too frequently and get annoyed by the intervention.")

## Example 4:

**Kick.it: The development of an evidence-based smoking cessation smartphone app by van Agteren et al., 2018 [68]**

van Agteren et al argued that although the design process steps 1–3 resulted in the selection of evidence-based BCTs and practical applications to accomplish behavioral change, they **did not provide sufficient guidance on the design of mHealth interventions.** Using the Persuasive System Design (PSD) framework helped van Agteren guide the overall functional development of Kick.it. The PSD framework provides intervention designers with **28 design principles** falling into four categories that aim to **ensure that the final system is actually capable of supporting sustainable health behavior change.**

# Test

solution against user needs and for its behavior change potential

Summary of approaches and methods from 75 studies [1-75]

DT

BD

## Heuristic Evaluation

### Design Thinking Testing

**Heuristic Evaluation:** Assess the intervention for the presence of Nielsen's 10 principles

### Behavioral Design Considerations

**BCT Evaluation:** Assess the intervention for the presence of BCTs and other nudges (using a pre-defined taxonomy)



## User Testing

### Design Thinking Testing

**Usability Testing:** Test the solution for its usability, functionality, acceptability, satisfaction, usefulness, and value. Track user comments, behavior, error rates and task completion time during testing. Testing can utilize Cognitive Walkthroughs, Think Aloud Methods, Participant Debrief, User Interview and Focus Groups, User Surveys (often using SUS Scale, MARS Scale, UTAUT Scale or the Five Dimensions of Usability).

### Behavioral Design Considerations

**BCT Usability Testing:** Tag components of the intervention that utilize BCTs, and follow how users engage with them, understand their acceptability, and assess their perceived usefulness and value.  
**Behaviorally Informed User Interview Guides:** Use behavioral theories/ models to develop interview guides to assess intervention's favourability to address specific behavioral determinants.



## Expert Evaluation

### Design Thinking Testing

**Expert Evaluation:** Expert perspectives can be elicited to assess appropriateness for target population, cultural sensitivity, message appeal, message readability, potential effectiveness, and technical feasibility (i.e., health providers, communication specialists, behavior change specialists, patient experts, etc.). Expert evaluation can be done using expert advisory panel meetings, expert consensus methods, health literacy evaluations, and content fidelity assessments.

### Behavioral Design Considerations

**BCT Fidelity Test:** Have behavior change experts assess the extent to which the intervention content has fidelity to the intended BCTs.  
**App Behavior Change Scale (ABACUS) Evaluation:** Assess the quality of the behavior change application and its potential to facilitate behavior change using ABACUS.  
**"Engagement" Definition:** Assess how experts conceptualize "engagement" in the context of the specific mHealth DBCI.



## Pilot Testing

### Design Thinking Testing

**Pilot with users:** Roll out the application for a short period of time to select members of the target population. Track usage behaviors, identify bugs/defects in implementation, conduct debrief interviews, and administer surveys to measure usefulness, attractiveness, and ease of use (and other measures/ scale).

### Behavioral Design Considerations

**Change in knowledge:** understanding of health content  
**Behavioral intentions:** app use and health behavior  
**State of change:** using Transtheoretical Model (TTM)  
**User experience with BCTs:** acceptance of BCTs  
**Perceived potential of BCTs:** beliefs on efficacy of BCTs  
**User engagement with BCTs:** Tracking use of BCTs  
**Random assignment to BCTs:** allocation to BCTs



# Test

the solution against user needs and for its behavior change potential

*Examples from included studies [45,42,27,44,26]*

## Example 1:

**Details of development of the resource for adults with asthma in the RAISIN (randomized trial of an asthma internet self-management intervention) study by Morrison et al., 2015 [45]**

The final version of the intervention was **formally mapped to Michie and colleagues latest BCT taxonomy** in order to describe which BCTs were present. Every page was reviewed (and where a BCT was explicitly meant to be assigned). Morrison et al did this evaluation to provide a reliable record of the content of the behavior change intervention, and to confirm that they included the BCTs as planned.

## Example 2:

***Development and Acceptability of a Tablet-Based App to Support Men to Link to HIV Care: Mixed Methods Approach by Mathenjwa et al., 2020 [42]***

Mathenjwa et al completed **in-depth user interviews** with participants who received the intervention. The interview questions explored why participants had not been linked to care after the HIV diagnosis and their views of the intervention and the impact it had on them. **Interviews were thematically analyzed with themes guided by Self-Determination Theory (SDT), to understand the intervention's potential impact on autonomy, competence, and relatedness.**

## Example 3:

***The development of Drink Less: an alcohol reduction smartphone app for excessive drinkers by Garnett et al., 2019 [27]***

Garnett et al. conducted a **usability testing study** to explore user views toward the app in order to **determine whether the BCTs were acceptable and feasible to users and how they might be improved.** The usability study consisted of two parts: **a think aloud study** to understand users' first impressions and **semistructured interviews** to investigate user's impressions of using the intervention in naturalistic settings.

## Example 4:

**A Personalized Physical Activity Coaching App for Breast Cancer Survivors: Design Process and Early Expert Evaluation by Moneiro-Guerra et al., 2020 [44]**

**An expert evaluation was performed with the mobile app rating scale (MARS) and the app behavior change scale (ABACUS) to assess the quality of the app and the potential for behavior change,** respectively. The MARS examined app elements such as engagement, functionality, utility, aesthetics, and information. An overall functionality score out of 5 was derived using this scale. The ABACUS scale comprises 21 items and was used to examine the potential behavior change of the app in relation to goal setting, action planning, barrier identification, self-monitoring, and feedback.

## Example 5:

**Design of a Mobile App for Nutrition Education (TreC-LifeStyle) and Formative Evaluation With Families of Overweight Children by Gabrielli et al., 2017 [26]**

Gabrielli et al conducted a pilot test of their intervention, and assessed: (1) **parents' knowledge** of the Mediterranean Diet guidelines; (2) **state of change** for healthy nutrition—measured by an adapted version of the URICA—short-form scale, based on the 4 readiness to change states of the Transtheoretical Model of Change, and (3) **intention to use** technology for nutrition education. **After 3 weeks of the app usage,** any changes on the above factors were recorded and parents' perceived usability of the app was assessed (System Usability Scale Questionnaire). **After 6 weeks of app usage,** any changes in the factors above were recorded again as well as a more in depth review of the participants' experience with the mHealth intervention in a semi-structured interview.

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