

Rlab #5: Personalized medicine with R

Our R-driven journey in the medical domain

R.L.Rossi – Milano 16/1/2018

P4 Medicine

● PREDICT ● PREVENT ● PERSONALIZE ● PARTICIPATE



Leroy Hood & Institute of Systems Biology, Seattle

Personalized medicine

(2005 - 2016)

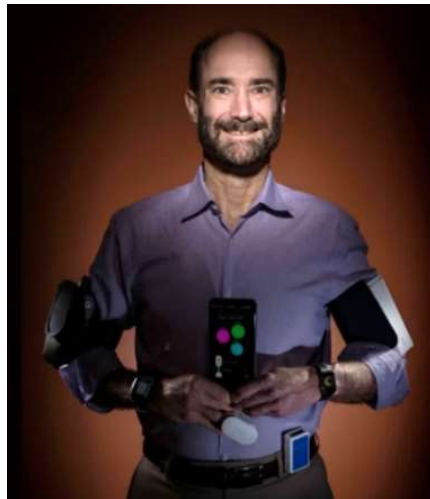
Precision medicine

(2015 - today)

Hi-definition medicine

(today)

Digital health
Quantified self



OPEN ACCESS

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RESEARCH ARTICLE

Digital Health: Tracking Physiomes and Activity Using Wearable Biosensors Reveals Useful Health-Related Information

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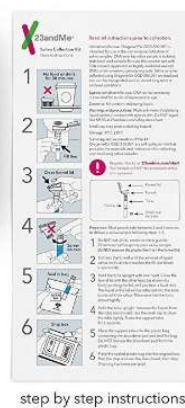
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Abstract

A new wave of portable biosensors allows frequent measurement of health-related physiology. We investigated the use of these devices to monitor human physiological changes during various activities and their role in managing health and diagnosing and analyzing disease. By recording over 250,000 daily measurements for up to 43 individuals, we found

2 billion measurements from 60 people, including continuous data from each participant's wearable biosensor devices and periodic data from laboratory tests of their blood chemistry, gene expression and other measures. Participants wore between one and seven commercially available activity monitors and other monitors that collected more than 250,000 measurements a day.

The actors today



nature
biotechnology

A wellness study of 108 individuals using personal, dense, dynamic data clouds

Nathan D Price^{1,2,6,7}, Andrew T Magis^{2,6}, John C Earls^{2,6}, Gustavo Glusman¹, Role Levy¹, Christopher Lausted¹, Daniel T McDonald^{1,5}, Ulrike Kusebauch¹, Christopher I Moss¹, Yong Zhou¹, Shizhen Qin¹, Robert I Moritz¹, Kristin Brogaard², Gilbert S Omenn^{1,3}, Jennifer C Lovejoy^{1,2} & Leroy Hood^{1,4,7}

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Personal data for 108 individuals were collected during a 9-month period, including whole genome sequences; clinical tests, metabolomes, proteomes, and microbiomes at three time points; and daily activity tracking. Using all of these data, we generated a correlation network that revealed communities of related analytes associated with physiology and disease. Connectivity within analyte communities enabled the identification of known and candidate biomarkers (e.g., gamma-glutamyltyrosine was densely interconnected with clinical analytes for cardiometabolic disease). We calculated polygenic scores from genome-wide association studies (GWAS) for 127 traits and diseases, and used these to discover molecular correlates of polygenic risk (e.g., genetic risk for inflammatory bowel disease was negatively correlated with plasma cystine). Finally, behavioral coaching informed by personal data helped participants to improve clinical biomarkers. Our results show that measurement of personal data clouds over time can improve our understanding of health and disease, including early transitions to disease states.

Disclaimers

Take it all with a grain of salt

We will not use such fancy data

- Sorry to inform you that we will actually deal with “**population**” **medicine**.

i.e. all reference values and evaluations are made relative to the mean population risk values

- Genetics (DNA) is where the story gets **really personal**.

Do you think your DNA impact on those risks?

→ *feel free to give your opinion*

Use it at your own risk

- Even if the science behind all this is sound, we are just making a R-related **coding exercise**.
Please do not be scared by your numbers (well, obviously enough you just need to be a *smoker* to have high risks, so beware of this first).
- I am a **molecular biologist**, *NOT* a physician or a clinician or a dietitian or a ...
(do not expect, and please don't ask, a diet or diagnosis from me)

Rlab #5 goals

What we would like to make

A GUI to input the followings:

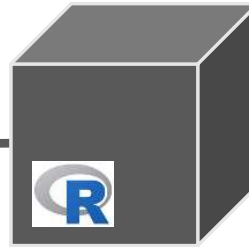
QUANTITATIVE INPUTS:

Gender, Age, BMI (height, weight),
Waist,
Blood pressure max & min,
Total cholesterol,
HDL ("good" cholesterol)

CLOSE QUESTIONS (yes/no) INPUTS:

Smoker; Daily motion; Daily veggies;
hypertension drug treatment;
High blood glucose;
Parents or siblings with T2D;
Relatives with T2D;
Parents or relatives with
hypertension;
Self affected by T2D

An R-based magic black
box for computations



The individual Relative
Risks (RR) as outputs

$RR_{overweight}$

$RR_{obesity}$

RR_{t2d}

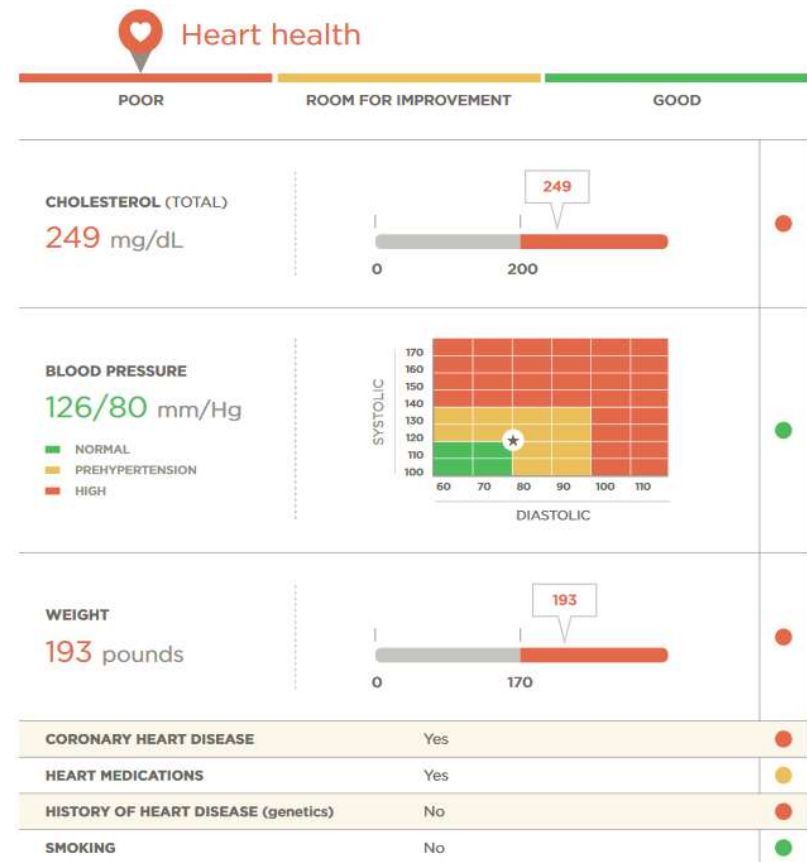
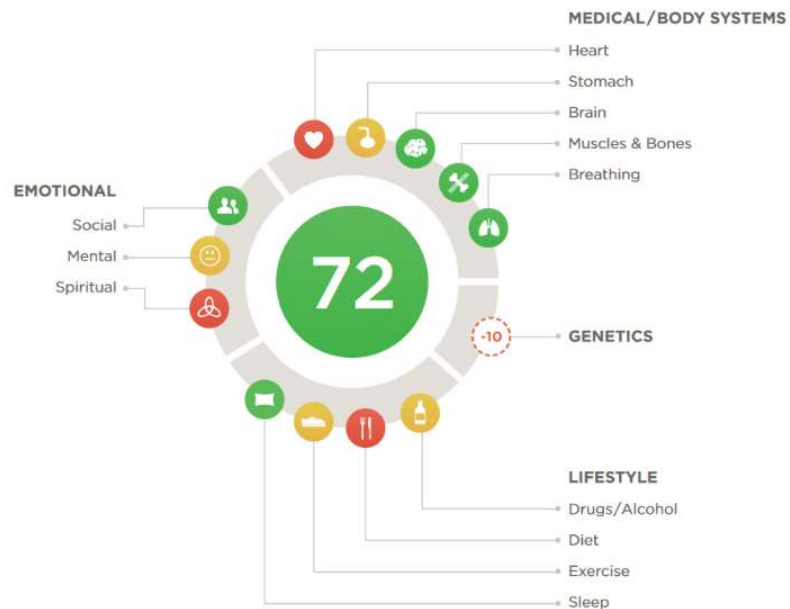
$RR_{hypertension}$

RR_{cvd}

A visualization
dashboard of
individual rel. risks

How do we communicate risk?

Comparables (a bunch of designs out there we can be inspired from)
and thoughts on risks communication



healthdesignchallenge.com

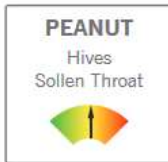
http://s3.amazonaws.com/challengepost/zip_files/production/5014/zip_files/healthed_pmr_contest_120112.pdf

ALLERGIES

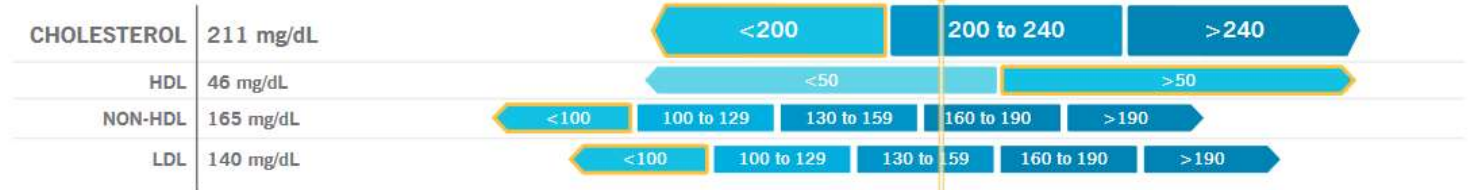
MEDICAL



FOOD



LIPID PANEL



VITAMIN D LEVEL TEST



C-REACTIVE PROTEIN LEVEL TEST



PROSTATE TEST



METABOLIC PANEL

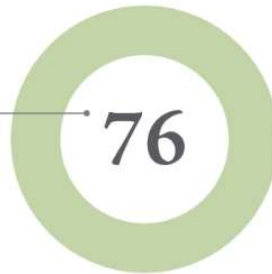


healthdesignchallenge.com

http://s3.amazonaws.com/challengepost/zip_files/production/4954/zip_files/Bsum%20CCOD%20Final.pdf?1354266187

Your Health Score

A single aggregated number ranging from 1-100 that represents your health status. Are you passing or failing?

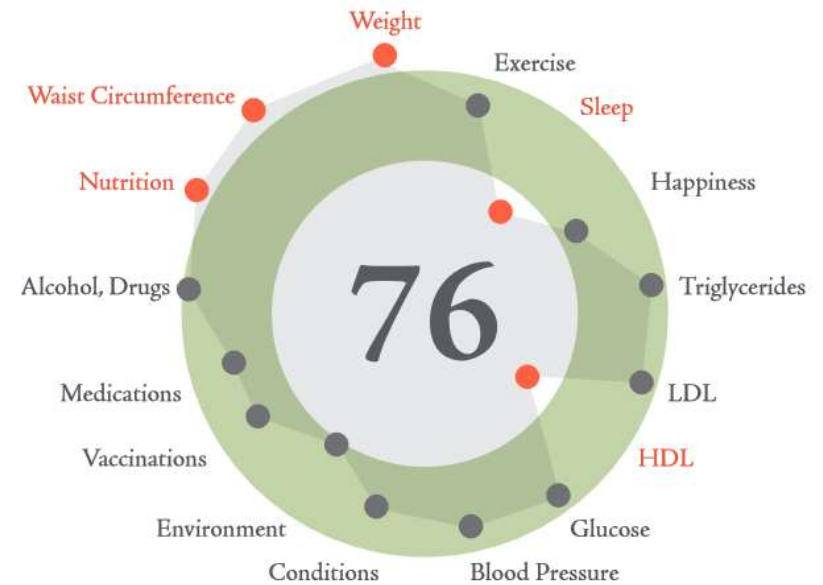
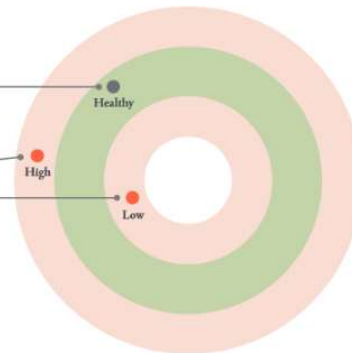


Healthy

Your healthy range is in the green zone.

Unhealthy

When you are not doing so well, your metrics are outside the green zone, either too high or too low.



healthdesignchallenge.com

https://s3.amazonaws.com/challengepost/zip_files/production/4940/zip_files/hgraph_goinvo_healthdesignchallenge.pdf?1354248603

BODY WEIGHT TREND GRAPH



BODY MASS INDEX RESULTS

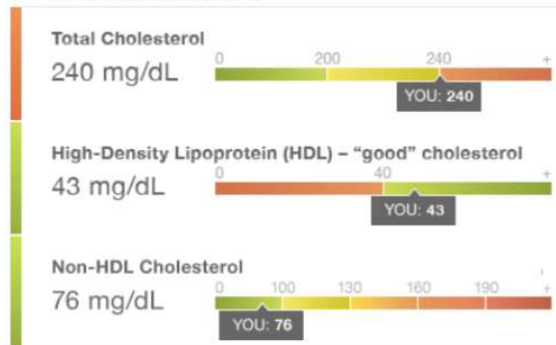


What does this mean?

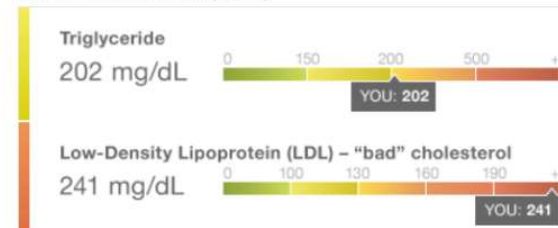
Your body mass index (BMI) calculation is a measure of body fat based on height and weight, which is a reliable indicator of obesity. Check out the National Heart Lung and Blood Institute [BMI calculator](#) to see where this number came from and what [steps you can take](#) to improve your BMI

Lipid Panel (11/20/2012 11:15 am)

LIPID PANEL LAB RESULTS (1 OF 2)



LIPID PANEL LAB RESULTS (2 OF 2)



<http://hdc.socialhealthinsights.com/bluebutton>



Samsung Health app

Just show numbers or graph them?

Change in perception



(difficult to understand)

Probability <

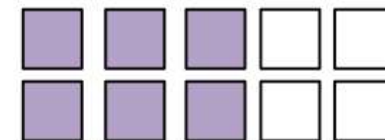
60%

Frequency

6 in 10

(easier to understand)

< Visualization



<http://www.vizhealth.org/>