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This document collects some interesting (stand-alone) math problems and their proofs. They are collected from literature study.

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### [Linear Programming] Randomized Kaczmarz Algorithm

Reference:

T. Strohmer and R. Vershynin. "Randomized Kaczmarz Algorithm with Exponential Convergence". Journal of Fourier Analysis and Applications 15.2 (2009).

https://people.eecs.berkeley.edu/~brecht/cs294docs/week1/09.Strohmer.pdf

- Classical Kaczmarz's method runs through a cyclic iteration
- Random version:

**Algorithm 1** (Random Kaczmarz algorithm). Let Ax = b be a linear system of equations as in (1) and let  $x_0$  be arbitrary initial approximation to the solution of (1). For  $k = 0, 1, \ldots$  compute

$$x_{k+1} = x_k + \frac{b_{r(i)} - \langle a_{r(i)}, x_k \rangle}{\|a_{r(i)}\|_2^2} a_{r(i)}, \tag{4}$$

where r(i) is chosen from the set  $\{1, 2, ..., m\}$  at random, with probability proportional to  $||a_{r(i)}||_2^2$ .

Proof is through comparing the distance to optimal solution across iterations.
Using orthogonal projection, distance reduction is bounded by an upper limit, which is related to matrix conditional number.

# [MATRIX] Orthogonal Projection

Please see <a href="https://www.math.utk.edu/">https://www.math.utk.edu/</a>
~mengesha/teaching/Math2025/Lecture8.pdf

https://textbooks.math.gatech.edu/ila/projections.html

## [Linear Algebra] Vector Decomposition, Span and Null

- A given vector can be decomposed into a sum of two vectors, one is in span space and the other in null space
- From {T. Strohmer and R. Vershynin. "Randomized Kaczmarz Algorithm with Exponential Convergence"}

direction, so we shall decompose  $\mathbb{R}^n = \operatorname{span}(x_0) \oplus (x_0)^{\perp}$ , writing every vector

•  $x \in \mathbb{R}^n$  as

$$x = x' \cdot x_0 + x''$$
, where  $x' \in \mathbb{R}$ ,  $x'' \in (x_0)^{\perp}$ .

- Other links include:
  - https://math.stackexchange.com/questions/1767601/why-any-vector-canbe-wriiten-as-the-sum-of-two-components-in-the-row-space-and
  - https://www.math.utah.edu/~zwick/Classes/Fall2012 2270/Lectures/Lecture21.pdf
  - An introduction to vector space: <a href="https://www2.stat.duke.edu/courses/Spring06/sta244/Handouts/vectorspaces.pdf">https://www2.stat.duke.edu/courses/Spring06/sta244/Handouts/vectorspaces.pdf</a>

## STATS] L1 and L2 regulation for feature selection

- L1 regulation is usually used for feature selection
  - https://towardsdatascience.com/ridge-and-lasso-regression-a-complete-guidewith-python-scikit-learn-e20e34bcbf0b
  - http://ethen8181.github.io/machine-learning/regularization/regularization.html