

H4: norms and distances	
4.1 normed vector spaces	
def: absolute value /modulus/magnitude	<p>For a field <math>\mathbb{F}</math></p> <p>&gt; this is a map <math>\mathbb{F} \rightarrow \mathbb{R}: x \mapsto  x </math> for which the properties apply:</p> <ul style="list-style-type: none"> <li>• non-negativity: <math>\forall x \in \mathbb{F},  x  \geq 0</math> (thus <math> \cdot </math> is actually a map <math>\mathbb{F} \rightarrow \mathbb{R}_{\geq 0}</math>),</li> <li>• multiplicativity: <math>\forall x, y \in \mathbb{F},  xy  =  x   y </math>,</li> <li>• subadditivity (also known as triangle inequality): <math>\forall x, y \in \mathbb{F},  x + y  \leq  x  +  y </math>.</li> <li>• positive definiteness: <math> x  = 0 \iff x = 0</math>,</li> </ul>
def: norm	<p>For <math>V</math> a vector space over a field <math>\mathbb{F}</math> with an absolute value</p> <p>&gt; the norm is a map <math>V \rightarrow \mathbb{R}: v \mapsto \ v\ </math> that satisfies (<math>\forall v, w \in V, \forall a \in \mathbb{F}</math>):</p> <ul style="list-style-type: none"> <li>• absolute homogeneity: <math>\ av\  =  a  \ v\ </math>,</li> <li>• subadditivity or triangle inequality: <math>\ v + w\  \leq \ v\  + \ w\ </math>.</li> <li>• positive definiteness: <math>\ v\  = 0 \iff v = 0</math>,</li> </ul>
def: normed vector space $(V, \ \cdot\ )$	= a vector space with a norm $\ \cdot\ $
<b>4.1.1 Hölder norms</b>	
def: Hölder's $p$ -norms	<p>For a vector <math>v = (v^1, \dots, v^n) \in \mathbb{F}^n</math></p> <p>&gt; for all <math>p \geq 1</math>:</p> $\ v\ _p = \left( \sum_{i=1}^n  v^i ^p \right)^{1/p}.$
def: Manhattan norm maximum norm Euclidean norm	<p>= norm for which <math>p=1</math></p> <p>= norm for which <math>p=\infty</math></p> <p>= norm for which <math>p=2</math></p>
Minkowski's inequality: $p$ and $q$	<p>assume <math>p \geq 1</math> and introduce <math>q</math>: <math>\frac{1}{p} + \frac{1}{q} = 1</math>. or <math>q = p/(p-1)</math>,</p>
lemma1: Young's inequality	<p>any two nonnegative numbers <math>a, b \in \mathbb{R}_{\geq 0}</math> satisfy Young's inequality:</p> $ab \leq \frac{a^p}{p} + \frac{b^q}{q}.$
lemma2: Hölder's inequality	<p>Any two vectors <math>v, w \in \mathbb{F}^n</math> satisfy the inequality:</p> $\sum_{i=1}^n  v^i   w^i  \leq \ v\ _p \ w\ _q$
> prop: Minkowski's inequality	<p>any two vectors <math>v, w \in \mathbb{F}^n</math> satisfy the inequality:</p> $\ v + w\ _p \leq \ v\ _p + \ w\ _p.$
def: the $\ell^p(\mathbb{F})$ space	<p>= subspace of vector space of all sequences <math>\mathbb{F}^{\mathbb{N}_0}</math></p> <p>&gt; contains all elements <math>v</math> for which <math>\sum_{i=1}^{+\infty}  v^i ^p</math> converges to a finite values</p>
<b>4.1.2 interlude: calculus in metric spaces</b>	
def: metric $d$	<p>for a set <math>X</math></p> <p>&gt; metric <math>d</math> is a binary function <math>X \times X \rightarrow \mathbb{R}_{\geq 0}</math> satisfying the properties:</p> <ul style="list-style-type: none"> <li>• identity of indiscernibles: <math>d(x, y) = 0 \iff x = y</math>,</li> <li>• symmetry: <math>d(x, y) = d(y, x)</math>,</li> <li>• triangle inequality: <math>d(x, y) + d(y, z) \geq d(x, z)</math>.</li> </ul> <p>A set <math>X</math> with a metric <math>d</math> is called a <b>metric space</b> <math>(X, d)</math></p>

prop: normed vector space to metric space	<p>A normed vector space <math>(V, \ \cdot\ )</math> becomes a metric space using the definition:</p> $d_V : V \times V \rightarrow \mathbb{R} : (v, w) \mapsto \ v - w\ .$
def: isometric map	<p>For a map <math>\Phi : X \rightarrow Y</math> between metric spaces <math>(X, d_X)</math> and <math>(Y, d_Y)</math></p> <p>&gt; this is a isometric map if it preserves distances:</p> $\forall x, x' \in X, d_X(x, x') = d_Y(\Phi(x), \Phi(x')).$
open subset	$S \subseteq X$ is open if for every $x \in S$ there is some $r > 0$ such that $B_r(x)$ is contained in $S$
closed subset	if $S^c = X \setminus S$ is open, then $S^c$ is closed
def: closure $\bar{S}$	<p>= smallest closed set containing <math>S</math></p> <p>ie: union of <math>S</math> with any possible limit point of sequences in <math>S</math></p>
dense subset	a subset $S \subseteq X$ is dense if $X = \bar{S}$
separable metric space $X$	= metric space that admits a dense subset and is countable
bounded metric set	= metric set for which there exists a real constant $M$ such that $d(x, y) < M$ for all $x, y$
<b>4.1.3 convergence and continuity in normed vector spaces</b>	
prop: norm as a function	the norm itself is a continuous function $V \rightarrow \mathbb{R}$
prop: vector addition and scalar mult.	<p>- vector addition is a continuous map from <math>V \times V</math> to <math>V</math></p> <p>- scalar multiplication is a continuous map from <math>\mathbb{F} \times V</math> to <math>V</math></p>
<b>4.1.4 equivalence of norms</b>	
def: equivalence of norms	<p>For two norms <math>\ v\ _a</math> and <math>\ v\ _b</math> on <math>V</math></p> <p>&gt; <math>\ \cdot\ _a</math> is equivalent with <math>\ \cdot\ _b</math> if they give rise to the same converging sequences with the same limits</p> <p>ie: <math>\lim_{k \rightarrow \infty} \ v_k - v\ _a = 0</math> if and only if <math>\lim_{k \rightarrow \infty} \ v_k - v\ _b = 0</math>.</p>
prop: equivalence of norms	<p>For two norms <math>\ v\ _a</math> and <math>\ v\ _b</math> on <math>V</math></p> <p>&gt; <math>\ \cdot\ _a</math> is equivalent with <math>\ \cdot\ _b</math> if and only if there exists constants <math>c, C &gt; 0</math> such that:</p> $\forall v \in V : c \ v\ _a \leq \ v\ _b \leq C \ v\ _a.$
prop: equivalence of norms on $V$	<p>For <math>V</math> a finite-dimensional vector space</p> <p>&gt; any two norms on <math>V</math> are equivalent</p>
> prop: continuity of norms on $V$	<p>For a finite-dimensional vector space <math>V</math></p> <p>&gt; any norm is continuous with respect to the metric generated by any other norms</p>
theorem: properties of norms > definition of compactness	<p>For a finite-dimensional vector space <math>V</math></p> <p>For a subset <math>U \subseteq V</math></p> <p>&gt; the following statements are equivalent and indicate that <math>U</math> is <i>compact</i>:</p> <ul style="list-style-type: none"> <li>• Every cover of <math>U</math> contains a finite subcover, i.e. if a set of open subsets <math>\{V_\alpha \subseteq V\}</math> covers <math>U</math> (which means <math>U \subseteq \bigcup \{V_\alpha\}</math>), then there exists a finite selection <math>\{V_{\alpha_1}, V_{\alpha_2}, \dots, V_{\alpha_k}\}</math> that covers <math>U</math>.</li> <li>• Any sequence in <math>U</math> has a convergent subsequence with limit point in <math>U</math>.</li> <li>• <math>U</math> is bounded and closed.</li> </ul>
Lemma: Riesz-lemma	<p>For <math>W</math> a closed proper subspace of <math>V</math></p> <p>For any <math>\varepsilon \in (0, 1)</math></p> <p>&gt; we can always find a <math>v_\varepsilon \in V</math> with <math>\ v_\varepsilon\  = 1</math> and <math>\ v_\varepsilon - w\  \geq \varepsilon</math> for all <math>w \in W</math>.</p>

4.2 Banach spaces	
4.2.1 Cauchy sequences and completeness	
def: Cauchy sequence	<p>Cauchy space in a metric space <math>(X, d_X)</math></p> <p>= a sequence of points <math>(x_n \in X)_{n \in \mathbb{N}_0}</math> such that:</p> $\text{for any } \varepsilon > 0, \exists N'_\varepsilon \in \mathbb{N} \text{ such that } \forall m, n > N'_\varepsilon, d_X(x_m, x_n) < \varepsilon.$
prop: Cauchy space and convergence	<p>For a metric space <math>(X, d_X)</math></p> <p>&gt; any sequence <math>(x_n \in X)_{n \in \mathbb{N}_0}</math> that converges to a limit <math>x</math> is a Cauchy space</p>
def: metric completeness	<p>the metric set <math>X</math> is metric complete</p> <p>&gt; if every Cauchy sequence in <math>X</math> has a limit</p>
def: Banach space	= normed vector space that is complete
prop: sequence and Banach spaces	All of the sequence spaces $\ell^p(\mathbb{F})$ over a complete field $\mathbb{F}$ are Banach spaces.
prop: Banach space of $C([a,b])$	The space of continuous functions $C([a,b])$ on a compact interval $[a,b]$ with the uniform norm $\ \cdot\ _\infty$ is a Banach space
4.2.2 dense subspaces, closures and complete sets	
def: complete set	<p>For <math>S \subseteq V</math> a subset of a Banach space <math>V</math> over the field <math>\mathbb{F}</math></p> <p>&gt; <math>S</math> is a complete set if <math>S</math> is such that the span <math>\mathbb{F}S</math> is dense in <math>V</math>, thus <math>\overline{\mathbb{F}S} = V</math>.</p>
prop: separability	if a Banach space $V$ admits a countable infinite set $S$ , it is separable
4.2.3 Convergence of series	
def: convergence	<p>For a series <math>\sum_{n=1}^{\infty} v_n</math> of vectors <math>v_n</math> in a normed vector space <math>(V, \ \cdot\ )</math></p> <p>For a vector <math>v \in V</math></p> <p>&gt; the series converges to <math>v</math> if the sequence of partial sums converge:</p> $\sum_{n=1}^{+\infty} v_n = v \iff \lim_{n \rightarrow \infty} \left\  \sum_{k=1}^n v_k - v \right\  = 0.$
def: absolutely convergent	<p>For a series <math>\sum_{n=1}^{+\infty} v_n</math> of vectors in a normed vector space <math>(V, \ \cdot\ )</math></p> <p>&gt; this series is absolutely convergent if:</p> $\sum_{n=1}^{\infty} \ v_n\  < \infty.$
prop: complete normed space	<p>For a normed space <math>(V, \ \cdot\ )</math></p> <p>&gt; this space is metric complete if and only if every absolutely convergent series converges</p> <p>&gt; then the space is thus a Banach space</p>
4.3 Norms for linear maps	
def: Frobenius norm	<p>For a matrix <math>A \in \mathbb{F}^{m \times n}</math></p> <p>&gt; the Frobenius norm is given by:</p> $\ A\ _F = \left( \sum_{i=1}^m \sum_{j=1}^n  A_{ij} ^2 \right)^{1/2} = \sqrt{\text{tr}(A^H A)}.$
4.3.1 continuity and subordinate norms	
def: bounded linear map	<p>For a linear map <math>\hat{A} \in \text{Hom}(V, W)</math></p> <p>&gt; <math>\hat{A}</math> is bounded if there exists a constant <math>C \in \mathbb{R}_{\geq 0}</math> such that <math>\ \hat{A}v\ _W \leq C \ v\ _V</math>.</p>
prop: equivalent statements for $\hat{A}$	<p>For a linear map <math>\hat{A} \in \text{Hom}(V, W)</math>, the following statements are equivalent:</p> <ol style="list-style-type: none"> <li>1. <math>\hat{A}</math> is bounded</li> <li>2. <math>\hat{A}</math> is continuous at the origin (or some other point).</li> <li>3. <math>\hat{A}</math> is continuous everywhere, and is in fact uniformly continuous.</li> </ol>

def: subspace of bounded linear maps	<p>For two normed vector spaces <math>(V, \ \cdot\ _V)</math> and <math>(W, \ \cdot\ _W)</math></p> <p>&gt; we define:  <math>\mathcal{B}(V, W) \subseteq \text{Hom}(V, W)</math> as the subspace of bounded linear maps between <math>V</math> and <math>W</math>.</p>
prop: $\mathcal{B} = \text{Hom}$	<p>For two normed vector spaces <math>(V, \ \cdot\ _V)</math> and <math>(W, \ \cdot\ _W)</math></p> <p>&gt; if <math>V</math> is finite-dimensional, then:  <math>\mathcal{B}(V, W) = \text{Hom}(V, W)</math>.</p>
def: subordinate	<p>For a norm <math>\ \hat{A}\ </math> for linear maps <math>\hat{A} \in \mathcal{B}(V, W)</math>  For two normed spaces <math>(V, \ \cdot\ _V)</math> and <math>(W, \ \cdot\ _W)</math></p> <p>&gt; if these normed spaces satisfy for all <math>v \in V</math>:</p> $\ \hat{A}v\ _W \leq \ \hat{A}\  \ v\ _V$ <p>the subordinate with respect to the vector norms <math>(V, \ \cdot\ _V)</math> and <math>(W, \ \cdot\ _W)</math></p>
def: operator norm /induced norm	<p>= smallest constant <math>C</math> which bounds a bounded linear map</p> <p>&gt; equivalent definitions:</p> $\begin{aligned} \ \hat{A}\ _{V \rightarrow W} &= \inf\{C \mid \ \hat{A}v\ _W \leq C \ v\ _V, \forall v \in V\} \\ &= \sup \left\{ \frac{\ \hat{A}v\ _W}{\ v\ _V} \text{ with } v \neq 0_V \right\} \\ &= \sup\{\ \hat{A}v\ _W \text{ with } \ v\ _V = 1\} \end{aligned}$
prop: induced norm and Banach space	<p>For <math>(V, \ \cdot\ _V)</math> a normed vector space  For <math>(W, \ \cdot\ _W)</math> a Banach space</p> <p>&gt; the space of bounded linear maps <math>\mathcal{B}(V, W)</math> together with the induced norm <math>\ \cdot\ _{V \rightarrow W}</math> is a Banach space</p>
def: submultiplicative	<p>For <math>\ \cdot\ </math> a norm on the space of linear operators <math>\text{End}(V)</math>  For <math>V</math> a vector space</p> <p>&gt; if <math>\ \hat{A}\hat{B}\  \leq \ \hat{A}\  \ \hat{B}\ </math>, then <math>\ \cdot\ </math> is said to be <b>submultiplicative</b>.</p>
prop: operator norm and submult.	<p>For <math>(V, \ \cdot\ _V)</math> a normed vector space</p> <p>&gt; the associated operator norm <math>\ \cdot\ _{V \rightarrow V}</math> on <math>\text{End}(V)</math> is submultiplicative</p>
<b>4.3.2 matrix norms</b>	
def: consistent matrix norm	<p>For a family of norms for all matrices: <math>\{\ \cdot\ ^{(m \times n)} : \mathbb{F}^{m \times n} \rightarrow \mathbb{R}_{\geq 0}; \forall m, n \in \mathbb{N}\}</math>  For all matrices <math>A \in \mathbb{F}^{m \times k}</math> and <math>B \in \mathbb{F}^{k \times n}</math>  For all <math>m, n, k \in \mathbb{N}</math></p> <p>&gt; the family is consistent if it satisfies:</p> $\ AB\ ^{(m \times n)} \leq \ A\ ^{(m \times k)} \ B\ ^{(k \times n)}$
prop: norms and matrix size	<p>The norms:</p> $\ A\ _p = \ A\ _{p \rightarrow p} \text{ that are induced by the vector } p\text{-norm}$ <p>can be defined for any matrix size, and form a consistent family of matrix norms</p>
prop: consistent Frobenius norm	<p>The Frobenius norm <math>\mathbf{A}_F</math> is consistent</p> <p>&gt; thus submultiplicative and subordinate with respect to vector 2-norm</p> <p>&gt; reduces for column matrices in <math>\mathbb{F}^{n \times 1}</math></p>

### 4.3.3 spectral radius and Gelfand formula

def: spectral radius	<p>The spectral radius of an operator <math>\hat{A} \in \text{End}(V)</math> is:</p> $\rho_{\hat{A}} = \sup\{ \lambda ; \lambda \in \sigma_{\hat{A}}\}.$
prop: norm and spectral radius	<p>For <math>\ \cdot\ </math> a submultiplicative norm on <math>\text{End}(V)</math>  For a finite-dimensional vector space <math>V</math>  For any <math>\hat{A} \in \text{End}(V)</math></p> <p>it holds: <math>\ \hat{A}\  \geq \rho_{\hat{A}}.</math></p>
prop: Gelfand formula	<p>For <math>\ \cdot\ </math> a submultiplicative norm on <math>\text{End}(V)</math>  For a finite-dimensional vector space <math>V</math>  For any <math>\hat{A} \in \text{End}(V)</math></p> <p>&gt; we have: <math>\lim_{n \rightarrow \infty} \ \hat{A}^n\ ^{1/n} = \rho_{\hat{A}}.</math></p>

### 4.3.4 dual norms

def: dual norm $\ \cdot\ ^*$	<p>For a normed vector space <math>(V, \ \cdot\ )</math>  For <math>V^* = \text{Hom}(V, \mathbb{F})</math></p> <p>&gt; the induced norm on <math>V^*</math> is also known as the dual norm <math>\ \cdot\ ^*</math>  ie: for <math>\xi \in V^*</math></p> $\ \xi\ ^* = \sup \left\{ \frac{ \xi[v] }{\ v\ }; \forall v \in V, v \neq 0 \right\}.$
prop: dual norm of normed vector space	<p>For the normed vector space <math>(\mathbb{F}^n, \ \cdot\ _p)</math>  (ie the standard <math>n</math>-dimensional vector space with Hölder <math>p</math>-norm)</p> <p>&gt; the dual norm of <math>\xi = (\xi_1, \dots, \xi_n) \cong \xi^T</math> is given by <math>\ \xi\ _p^* = \ \xi\ _q</math>  with <math>q</math> such that <math>\frac{1}{p} + \frac{1}{q} = 1</math>.</p>

## 4.4 applications

### 4.4.1 functions of matrices revisited

function on matrix	<p>define the application of a function <math>f: \mathbb{C} \rightarrow \mathbb{C}</math> to an operator <math>\hat{A} \in \text{End}(V)</math> :</p> <p>When the function <math>f</math> has a Taylor series:</p> $f(z) = \sum_{n=0}^{+\infty} f_n z^n$ <p>that converges absolutely for all <math>z</math> with <math> z  &lt; R</math>  &gt; <math>R</math> is the convergence radius</p> <p>Define a norm on <math>\text{End}(V)</math>  &gt; investigate the convergence of the series:</p> $\sum_{n=0}^{+\infty} f_n \hat{A}^n. \quad (4.34)$ <p>In particular, if <math>\ \cdot\ </math> is a submultiplicative norm on <math>\text{End}(V)</math>, so that <math>\ \hat{A}^n\  \leq \ \hat{A}\ ^n</math>, we have</p> $\sum_{n=0}^{+\infty} \ f_n \hat{A}^n\  = \sum_{n=0}^{+\infty}  f_n  \ \hat{A}^n\  \leq \sum_{n=0}^{+\infty}  f_n  \ \hat{A}\ ^n \quad (4.35)$ <p>&gt; is guaranteed to converge if <math>\ \hat{A}\  &lt; R</math></p>
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