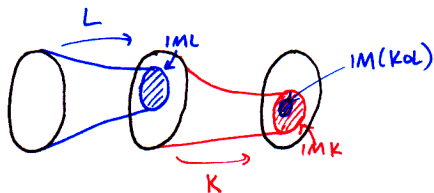


1. IF A LINEAR TRANSFORMATION  $L: V \rightarrow W$  IS INVERTIBLE, THEN  $L$  MUST BE BIJECTIVE, SO NULLITY  $L=0$  AND  $\text{RANK } L = \text{DIM } W$ . BUT IF  $L$  IS A BIJECTIVE L.T., THEN IT IS AN ISOMORPHISM, SO  $V \cong W$  AND THUS  $\text{DIM } V = \text{DIM } W$ . IN SUMMARY,  $\text{RANK } L = \text{DIM } V = \text{DIM } W$ , AND NULLITY  $L=0$ .

2.  $L: V \rightarrow W$  AND  $K: W \rightarrow U$ : LINEAR TRANSFORMATIONS



- (a) CLAIM:  $\text{IM}(K \circ L) \subset \text{IM } K \rightarrow$  I.E.,  $\vec{u} \in \text{IM}(K \circ L) \Rightarrow \vec{u} \in \text{IM } K$

PROOF: SUPPOSE THAT  $\vec{u} \in \text{IM}(K \circ L)$

[RECALL THAT  $\text{IM}(K \circ L) = \{ (K \circ L)(\vec{v}) : \vec{v} \in V \}$

THEN  $\vec{u} = (K \circ L)(\vec{v})$ , WHERE  $\vec{v} \in V$

SO BY DEFINITION,  $\vec{u} = K(L(\vec{v}))$  \*

[GOAL:  $\vec{u} \in \text{IM } K = \{ K\vec{w} : \vec{w} \in W \}$  — NEED TO FIND  $\vec{w}$ !

LET  $\vec{w} = L(\vec{v}) \in W$ .

THEN  $K\vec{w} = K(L(\vec{v})) = \vec{u}$  FROM \*,

SO BY DEFINITION,  $\vec{u} \in \text{IM } K$ . ■

COROLLARY:  $\text{RANK}(K \circ L) \leq \text{RANK } K$

PROOF: SINCE  $\text{IM}(K \circ L)$  IS A SUBSPACE OF  $\text{IM } K$ ,

$\text{DIM}(\text{IM}(K \circ L)) \leq \text{DIM}(\text{IM } K)$ ,

SO BY DEFINITION OF RANK,  $\text{RANK}(K \circ L) \leq \text{RANK } K$ . ■

- (b) CLAIM:  $\text{RANK}(K \circ L) \leq \text{RANK } L$

PROOF: LET  $\{\vec{k}_1, \dots, \vec{k}_n\}$  AND  $\{\vec{v}_1, \dots, \vec{v}_r\}$  BE A BASIS FOR  $V$ , WHERE  $\{\vec{k}_1, \dots, \vec{k}_n\}$  ARE A BASIS FOR  $\text{KER } L$  AND  $r = \text{RANK } L$ , AS IN THE PROOF OF THE RANK + NULLITY THEOREM. THEN SINCE THIS COLLECTION SPANS  $V$ , THE COLLECTION

$$\{(K \circ L)(\vec{k}_1), \dots, (K \circ L)(\vec{k}_n); (K \circ L)(\vec{v}_1), \dots, (K \circ L)(\vec{v}_r)\}$$

SPANS  $\text{IM}(K \circ L)$ .

BUT  $\forall i, (K \circ L)(\vec{k}_i) = K(L(\vec{k}_i))$

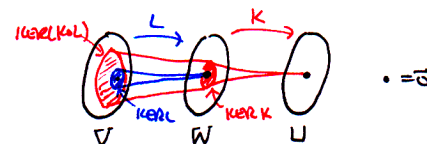
$$= K(\vec{0}) \quad \text{SINCE } \vec{k}_i \in \text{KER } L \\ = \vec{0}$$

SO  $\{(K \circ L)(\vec{v}_1), \dots, (K \circ L)(\vec{v}_r)\}$  SPANS  $\text{IM}(K \circ L)$ ,

AND THUS CAN BE REDUCED TO A BASIS FOR  $\text{IM}(K \circ L)$ ;

THUS,  $\text{DIM}(\text{IM}(K \circ L)) \leq r = \text{RANK } L$ ,

SO BY DEFINITION,  $\text{RANK}(K \circ L) \leq \text{RANK } L$ . ■



- (c) CLAIM:  $\text{KER } L \subset \text{KER}(K \circ L) \rightarrow$  I.E.,  $\vec{v} \in \text{KER } L \Rightarrow \vec{v} \in \text{KER}(K \circ L)$

PROOF: LET  $\vec{v} \in \text{KER } L$ ; THEN BY DEFINITION,  $L(\vec{v}) = \vec{0}_W$ .

[GOAL:  $\vec{v} \in \text{KER}(K \circ L)$ , I.E.,  $(K \circ L)(\vec{v}) = \vec{0}_U$ ]

THUS,  $(K \circ L)(\vec{v}) \stackrel{\text{DEF}}{=} K(L(\vec{v})) = K(\vec{0}_W) = \vec{0}_U$ . ■

COROLLARY:  $\text{NULLITY}(K \circ L) \geq \text{NULLITY } L$

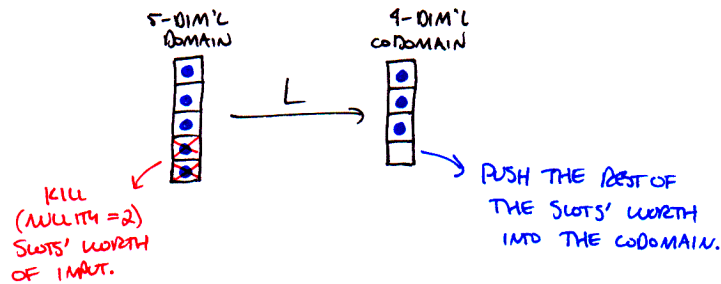
PROOF: SINCE  $\text{KER } L$  IS A SUBSPACE OF  $\text{KER}(K \circ L)$ ,

$\text{DIM}(\text{KER } L) \leq \text{DIM}(\text{KER}(K \circ L))$ , SO BY DEFINITION,  $\text{NULLITY } L \leq \text{NULLITY}(K \circ L)$ . ■

3. WE THINK OF AN  $n$ -DIMENSIONAL VECTOR SPACE AS HAVING "SIZE"  $n$  (FORMALLY, THIS IS JUSTIFIED BY COUNTING THE NUMBER OF VECTORS IN ANY BASIS FOR IT).

WE'VE SEEN IN OUR PROOF OF THE RANK + NULLITY THEOREM THAT ANY LINEAR TRANSFORMATION FROM ONE SUCH SPACE TO ANOTHER KILLS ITS NULLITY'S WORTH OF THESE AND GENERATES AN IMAGE OF SIZE GIVEN BY ITS RANK.

E.G., FOR  $L: \mathbb{R}^5 \rightarrow \mathbb{R}^4$  OF RANK 3 ( $\therefore$  NULLITY 2),

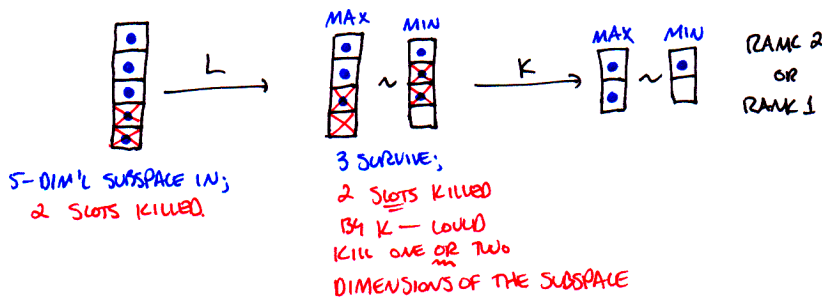


FOLLOWING THE "SIZE" OF THE SUBSPACES AS THEY'RE PUSHED THROUGH GIVES US THE RANK OF A COMPOSITION; COUNTING HOW MANY ARE KILLED GIVES US THE NULLITY.

\* KEY: A L.T. WILL KILL ITS NULLITY'S WORTH OF SLOTS!

E.G.,  $K \circ L$ , WHERE  $L$  IS AS ABOVE

AND  $K: \mathbb{R}^4 \rightarrow \mathbb{R}^2$  HAS RANK 2:



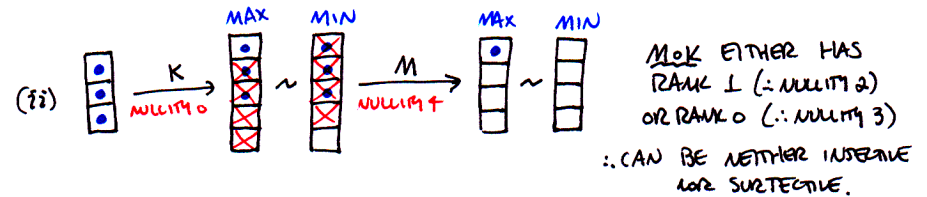
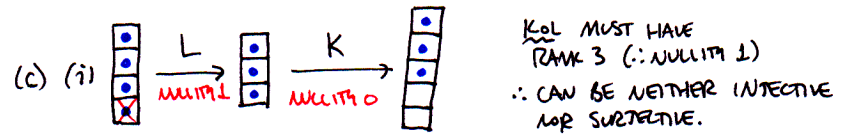
NET EFFECT:  $K \circ L$  MUST HAVE RANK 2 OR 1.

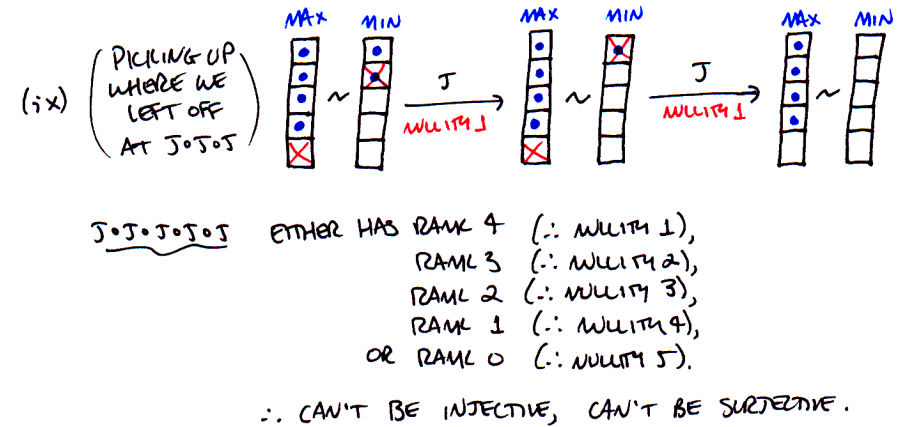
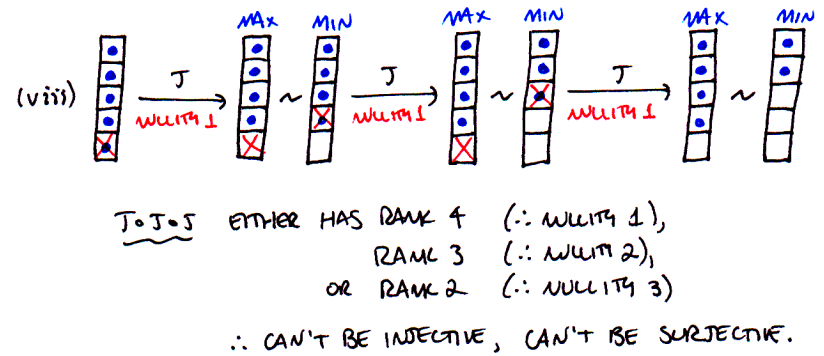
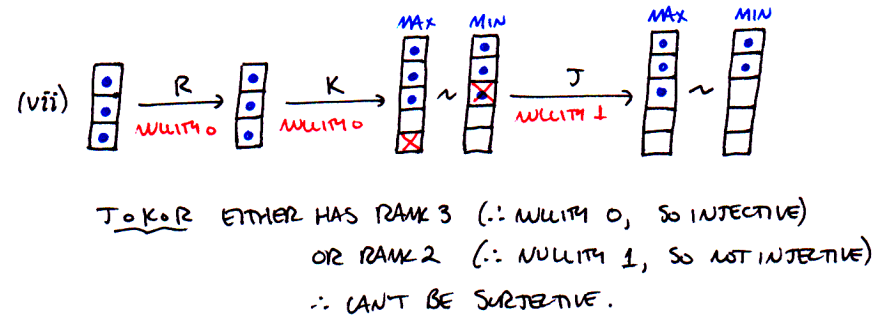
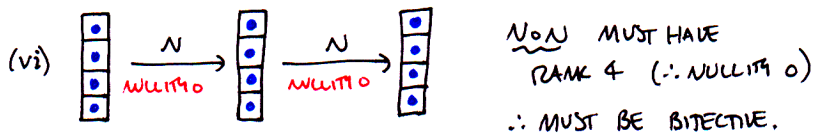
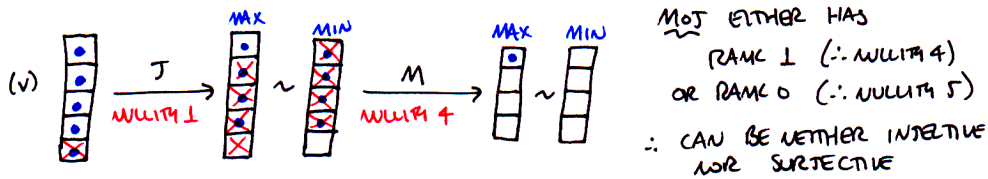
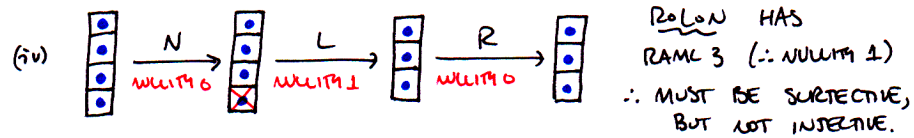
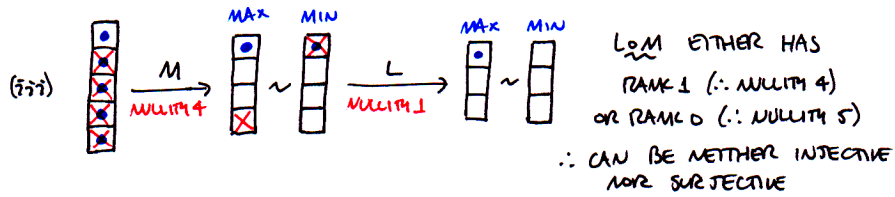
(KEEPING TRACK OF THE EXTREME CASES SHOWS YOU THE POSSIBLE RANGE OF DIMENSIONS)

4. (a) (JUST USE RANK + NULLITY = DIM OF DOMAIN)

- NULLITY  $L = 4 - 3 = 1$
- NULLITY  $K = 3 - 3 = 0$
- NULLITY  $M = 5 - 1 = 4$
- NULLITY  $N = 4 - 4 = 0$
- NULLITY  $R = 3 - 3 = 0$
- NULLITY  $J = 5 - 4 = 1$

- (b)
- $L$  IS NOT INJECTIVE (NULLITY  $\neq 0$ ), BUT IS SURJECTIVE (RANK = 3)
  - $K$  IS INJECTIVE (NULLITY = 0), BUT NOT SURJECTIVE (RANK = 3 < 5)
  - $M$  IS NOT INJECTIVE (NULLITY  $\neq 0$ ) AND NOT SURJECTIVE (RANK = 1 < 4)
  - $N$  IS BIJECTIVE (NULLITY = 0, RANK = 4)
  - $R$  IS BIJECTIVE (NULLITY = 0, RANK = 3)
  - $J$  IS NOT INJECTIVE (NULLITY  $\neq 0$ ) AND NOT SURJECTIVE (RANK = 4 < 5)





5.  $A: m \times n$  MATRIX;  $B: n \times p$  MATRIX

(a) AS A L.T.,  $A: \mathbb{R}^n \rightarrow \mathbb{R}^m$  AND  $B: \mathbb{R}^p \rightarrow \mathbb{R}^n$ .  
DOMAIN CODOMAIN      DOMAIN CODOMAIN

(b) THE MATRIX  $AB$  SIMPLY MEANS THE MATRIX FOR THE CORRESPONDING COMPOSITION  $A \circ B: \mathbb{R}^p \rightarrow \mathbb{R}^m$ .

THUS,  $AB$  IS AN  $m \times p$  MATRIX, AND OUR RULE FOR COMPUTING IT SIMPLY COMES FROM ANALYZING THE COMPOSITION  $A \circ B$  AS A LINEAR TRANSFORMATION.

(c) THE  $j^{\text{TH}}$  COLUMN OF  $AB$

$$\begin{aligned} &= AB\vec{e}_j \\ &= A(B\vec{e}_j) \quad \text{BECAUSE } AB \text{ IS A COMPOSITION} \\ &= A(j^{\text{TH}} \text{ COLUMN OF } B) \\ &= \text{L.C. OF COL'S OF } A, \text{ WITH SCALARS GIVEN BY THE } j^{\text{TH}} \text{ COL. OF } B. \end{aligned}$$

E.G.,  $\begin{bmatrix} 2 & 1 \\ 1 & 4 \\ 3 & 0 \end{bmatrix} \begin{bmatrix} 1 & -1 & 4 & 0 \\ 2 & 3 & 5 & 2 \end{bmatrix} = \begin{bmatrix} 4 & 1 & 13 & -2 \\ 9 & 11 & 24 & -8 \\ 3 & -3 & 12 & 0 \end{bmatrix}$

6. THE IDENTITY MATRIX OF SIZE  $n$  IS  $I_n = \begin{bmatrix} 1 & 0 & 0 & 0 \\ 0 & 1 & 0 & 0 \\ \vdots & \vdots & \ddots & \vdots \\ 0 & 0 & 0 & 1 \end{bmatrix}$ ,

WHICH CORRESPONDS TO THE STANDARD BASIS FOR  $\mathbb{R}^n$ .

THIS MATRIX GIVES US THE IDENTITY L.T.:  $\mathbb{R}^n \rightarrow \mathbb{R}^n$ ,  $I_n \vec{x} = \vec{x}$ ,

SO  $\bullet I_n \vec{x} = \vec{x} \quad \forall \vec{x} \in \mathbb{R}^n$

$\bullet AI_n = A$  FOR ANY  $m \times n$  MATRIX  $A$

$\bullet I_n B = B$  FOR ANY  $n \times p$  MATRIX  $B$ .

*\*  $I_n$  EVAPORATES ANYWHERE THAT IT ACTS ON A VECTOR OR IS COMPOSED WITH ANOTHER MATRIX!*

7. (a) AN INVERSE FOR A MATRIX  $A$  IS A MATRIX  $A^{-1}$  FOR WHICH  $A^{-1}A = I = AA^{-1}$  (WHERE  $I$  IS THE IDENTITY MATRIX OF THE APPROPRIATE SIZE).

(I.E., IT'S THE INVERSE FUNCTION FOR THE L.T. GIVEN BY  $A$ )

$A$  IS CALLED INVERTIBLE IF IT HAS AN INVERSE.

(b) IN ORDER FOR  $A$  TO BE INVERTIBLE, IT MUST BE SQUARE, WITH "FULL RANK" AND ZERO NULLITY.

*↳ I.E. RANK AS BIG AS POSSIBLE — HERE, THIS MEANS EQUAL TO THE # OF ROWS (OR COLUMNS) OF  $A$ .*

(c) USING THE FACT THAT  $AA^{-1} = I$ , WE CAN FIND THE  $j^{\text{TH}}$  COLUMN OF  $A^{-1}$  AS FOLLOWS:

$$AA^{-1}\vec{e}_j = I\vec{e}_j = \vec{e}_j, \text{ SO } A(A^{-1}\vec{e}_j) = \vec{e}_j$$

$$\text{I.E., } A(j^{\text{TH}} \text{ COLUMN OF } A^{-1}) = \vec{e}_j,$$

SO THE  $j^{\text{TH}}$  COLUMN OF  $A^{-1}$  IS SIMPLY THE SOLUTION OF THE SYSTEM  $[A | \vec{e}_j]$ .

WE CAN THUS FIND ALL COLUMNS OF  $A^{-1}$  AT ONCE BY REDUCING THE MULTIPLY-AUGMENTED SYSTEM  $[A | I]$ :

$$[A | I] \rightsquigarrow [I | A^{-1}]$$

*ANALYZING THE RESULT SHOWS US THAT THE COLUMNS HERE ARE PRECISELY THOSE OF  $A^{-1}$ !*  
*↳ SINCE  $A$  IS SQUARE + HAS FULL RANK, THE LEFT SIDE MUST REDUCE TO THIS!*

\* IF WE TRY THIS FOR A NON-INVERTIBLE MATRIX  $A$ , THE LEFT SIDE WON'T COME OUT TO  $I$ , AND THE SYSTEM WILL BE INCONSISTENT IN SOME COLUMN(S).

(d) CLAIM: IF  $AA^{-1} = I$  AND  $BA = I$ , THEN  $B = A^{-1}$

PROOF: SUPPOSE THAT  $AA^{-1} = I$  AND  $BA = I$ . THEN RIGHT-COMPOSING  $BA = I$  WITH  $A^{-1}$  WE HAVE  $BAA^{-1} = IA^{-1}$

$$\begin{aligned} \text{SO } BI &= A^{-1} && \text{BY THE HYPOTHESIS THAT } AA^{-1} = I \\ \therefore B &= A^{-1} && \text{BY PROPERTIES OF } I \quad \blacksquare \end{aligned}$$

8. IF WE HAVE AN INVERSE  $A^{-1}$  FOR  $A$ , THEN

$$A\vec{x} = \vec{b} \Rightarrow A^{-1}(A\vec{x}) = A^{-1}\vec{b} \quad (\text{COMPOSING WITH } A^{-1} \text{ ON THE LEFT})$$

$$\Rightarrow (A^{-1}A)\vec{x} = A^{-1}\vec{b}$$

$$\Rightarrow I\vec{x} = A^{-1}\vec{b} \quad \text{BY DEFINITION OF INVERSE}$$

$$\Rightarrow \underline{\vec{x} = A^{-1}\vec{b}} \quad \text{BY PROPERTIES OF } I$$

— I.E., JUST LET  $A^{-1}$  ACT ON  $\vec{b}$

\* HOWEVER, THE INITIAL "IF" MAKES THIS AN EXTREMELY SPECIALIZED APPROACH: IT ONLY WORKS FOR "SQUARE" SYSTEMS, HAVING THE SAME NUMBER OF EQUATIONS + UNKNOWN, AND IT ONLY WORKS IF THE COEFFICIENT MATRIX IS INVERTIBLE!