

MODUL 7

SAS® DATA PREPARATION APPLICATION

THEME DESCRIPTION

Students are able to carry out Data Preparation which is an important process for analytical and predictive modeling including the process of cleaning, transforming, and managing data using SAS Data Preparation application features that do not require coding-less programming skills.

WEEKLY LEARNING OUTCOMES (SUB-LESSONS)

CLO-2-Sub-CLO-7, Able to properly implement the data curation process, part of the role of data science including the component aspects of the computing environment.

Through the following learning steps:

1. Referencing external files
2. Creating indicators for the first and last observation in a by group
3. Transposing the rows and columns in a table
4. Statistical and mathematical data transformations

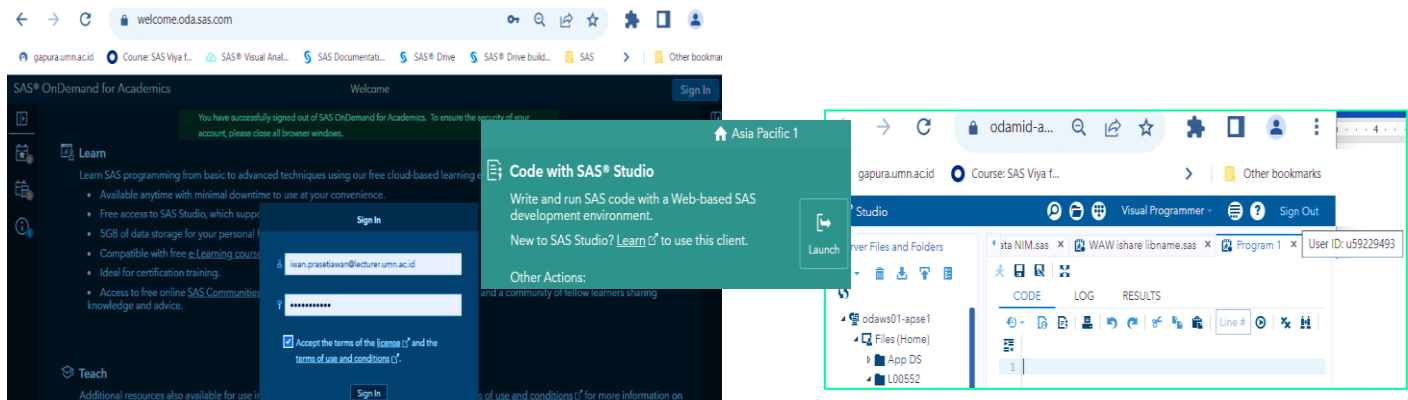
PRACTICUM SUPPORT

- a. Windows Operating System
- b. (any) Browser Application

PRACTICUM STEPS

Login to SAS Studio

Start, <https://welcome.oda.sas.com>



1. Referencing external files

- ▶ While a SAS library is a pointer to a data storage location that has data stored in tables, SAS programmers also use statements and **data step options to work directly with raw external files**.
- ▶ SAS provides programmers with the flexibility of **referencing files either directly or indirectly**.

Directly referencing external files

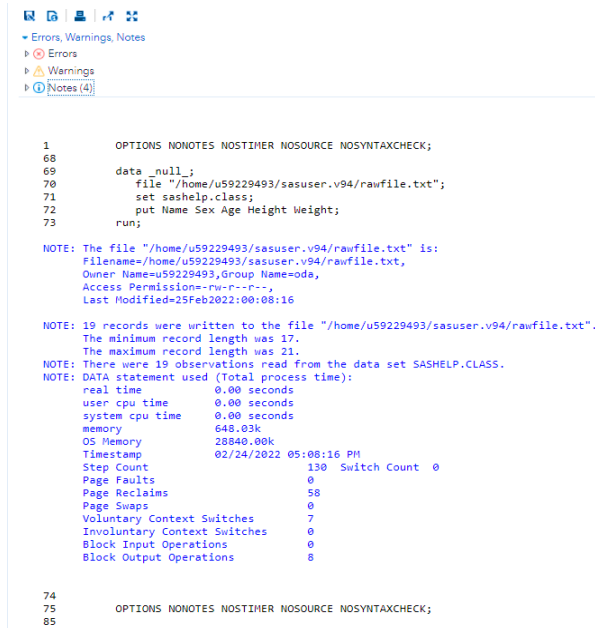
- ▶ Data step code has two statements for with external files.
- ▶ The infile statement uses the external file for reading or for input, and the file statement is used to write information into an external file for storage.
- ▶ Both the infile and file statements refer directly to the external file using the directory location and name of the file.

- ▶ For example, here is some pseudo-SAS code for using an external file named **rawfile.txt** as input in a data step:
- a. SASHELP library has a class table consisting of 19 students inside with the attributes of Name, Sex, Age, Height and Weight of the students.
Step to seeing the table: Library – SASHELP – Class then clicked twice to get inside the table.
- b. Use below code to get copy the class table from SASHELP library into your CAS home directory

```
/* copy text file from SASHELP Library for Class table into your home CAS library*/
data _null;
  file "/home/u59229493/sasuser.v94/rawfile.txt";
  set sashelp.class;
  put Name Sex Age Height Weight;
run;
```

Your home UID

- c. Submit this code by selecting the running man icon and check it out what the log says:



```
1      OPTIONS NONOTES NOSTIMER NOSOURCE NOSYNTAXCHECK;
68
69      data _null;
70          file "/home/u59229493/sasuser.v94/rawfile.txt";
71          set sashelp.class;
72          put Name Sex Age Height Weight;
73      run;

NOTE: The file "/home/u59229493/sasuser.v94/rawfile.txt" is:
      Filename=/home/u59229493/sasuser.v94/rawfile.txt,
      Owner Name=u59229493,Group Name=oda,
      Access Permission=-rw-r--r--,
      Last Modified=25Feb2022:00:08:16

NOTE: 19 records were written to the file "/home/u59229493/sasuser.v94/rawfile.txt".
      The minimum record length was 17.
      The maximum record length was 21.
NOTE: There were 19 observations read from the data set SASHELP.CLASS.
NOTE: DATA statement used (Total process time):
      real time           0.00 seconds
      user cpu time       0.00 seconds
      system cpu time     0.00 seconds
      memory              648.03k
      OS Memory          20840.00k
      Timestamp          02/24/2022 05:08:16 PM
      Step Count         130   Switch Count   0
      Page Faults        0
      Page Reclaims      58
      Page Swaps         0
      Voluntary Context Switches 7
      Involuntary Context Switches 0
      Block Input Operations 0
      Block Output Operations 8

74
75      OPTIONS NONOTES NOSTIMER NOSOURCE NOSYNTAXCHECK;
85
```

- d. Not only will you see this information in the LOG, but also the raw.txt file will be seen. Select Server Files and Folders in the left of SAS Studio and expand My Folders and then sasuser.v94.

Indirectly referencing external files

- ▶ SAS also provides a filename statement that similarly to the libname statement.
- ▶ While the libname statement creates a pointer or libref to a location that stores data in tables, the filename statement assigns a pointer or fileref to an external file.
- ▶ This indirect reference is convenient to make one reference to a file within a program, which may be used multiple times and therefore can easily be updated in the future by changing one line instead of multiple direct references.
- d. Here is what a filename statement looks like in code:
`filename myfile "/home/u59229493/sasuser.v94/rawfile.txt";`
- e. Now, a programmer can use this fileref in combination with the direct infile and file statements. Type the following code in a new SAS Studio program section:

```
filename myfile "/home/u59229493/sasuser.v94/rawfile.txt";
data work.myraw;
  infile myfile;
  input Name $ Sex $ Age Height Weight;
run;
```

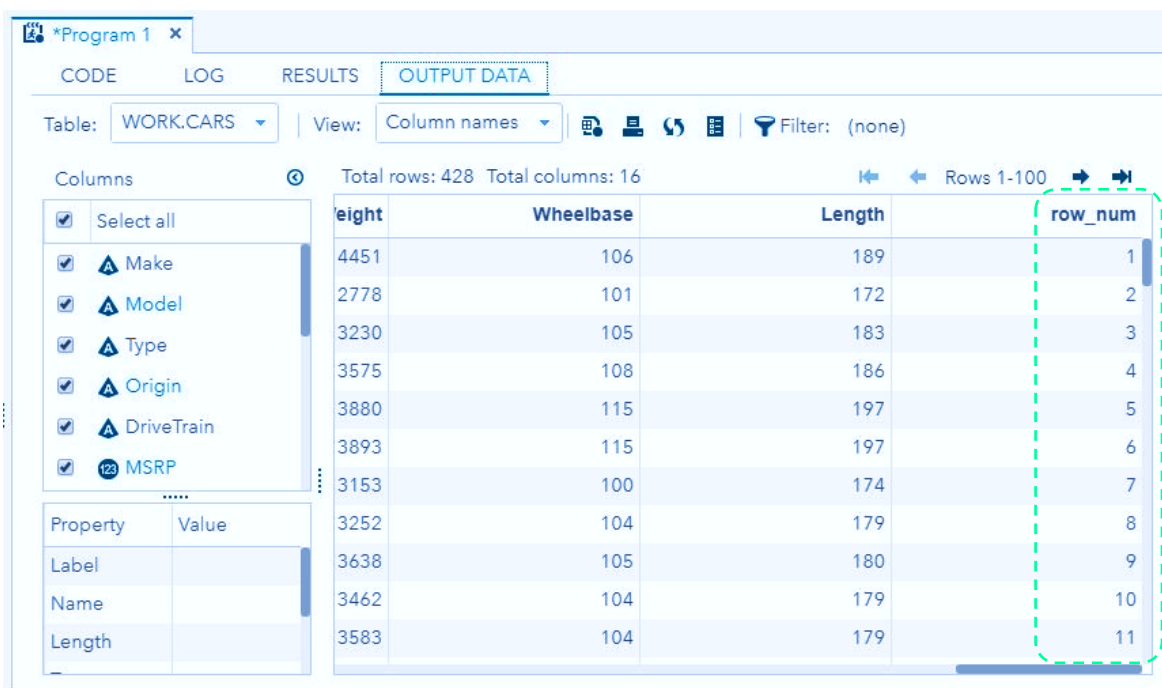
You could get your results and **print into pdf file as figure output A by format file name as 'IS-429 Lab Week#7 A results'.**

2. Creating indicators for the first and last observation in a by group

- ▶ It is very convenient to be able to easily the first and last observation with a group of observations.
- ▶ For example, if you need to identify a sequence of events that some entity performs, but the data you receive from various sources doesn't happen to provide you with the in this type of format,
- a. It can be difficult and time-consuming to rearrange this data into the proper sequence. One simple way to use this automatic variable is to add a row number variable to a table that doesn't already have one.
- b. Type the following code in a program section in SAS Studio and submit it:

```
data work.cars;
  set sashelp.cars;
  row_num=_N_;
run;
```

- c. In the OUTPUT DATA table preview window, scroll all the way to the right within the window and you will see the new column named row_num. It contains the value that corresponds to the row number within the new work.cars table (1 through 428):



height	Wheelbase	Length	row_num
4451	106	189	1
2778	101	172	2
3230	105	183	3
3575	108	186	4
3880	115	197	5
3893	115	197	6
3153	100	174	7
3252	104	179	8
3638	105	180	9
3462	104	179	10
3583	104	179	11

- ▶ Likewise, the SAS data step identifies the first observation and last observation of a by group by creating temporary variables for each variable listed in the by statement.
- ▶ These temporary variables are named **FIRST.variablename** and **LAST.variablename**. Similar to **_N_**, these temporary variables can be used to control program logic within the execution of the data step.
- ▶ The values of **FIRST.variablename** and **LAST.variablename** indicates **whether** an observation with that **by group is one of the following positions**:
 - ◆ The first one in a by group
 - ◆ The last one in a by group
 - ◆ Neither the first nor the last one in a by group
 - ◆ Both first and last, as is the case when there is only one observation in a by group
 As a result users can take actions conditionally, based on whether they are processing the first or the last observation in a by group.
- ▶ The value of **FIRST.variablename** = 1 for the first row associated with the BY variable; otherwise, it has a value of 0.
- ▶ Likewise, the value of **LAST.variablename** = 1 for the last row associated with the by variable; otherwise it has a value of 0.

- d. Type the following code in a program section in SAS Studio and submit it:

```
proc sort data=sashelp.cars out=work.cars2;
  by Make Type;
quit;

data work.cars3;
  set work.cars2;
  by Make Type;
  if FIRST.Make and FIRST.Type then output;
  if NOT FIRST.Make and FIRST.Type then output;
run;
```

- ▶ You will have the result by no sequence number occurs.
 - ▶ This code will result in a dataset, work.cars3, which is a single type of car from each make (or manufacture) instead of multiple types from the same make.
 - ▶ **The first if statement** outputs the row corresponding to the car associated with a specific make and the first type from that make, while the second if is responsible for outputting the first type of each other type associated with that particular make
- e. To further illustrate the usefulness of these temporary variables, let's add a fake sequence number associated with each make from work.cars2:

```
data work.cars4;
  set work.cars2;
  by Make;
  if FIRST.Make then sequence=1;
  else sequence=sequence+1;
  retain sequence;
  if LAST.Make then put "There are " sequence "of " make;
run;
```

- ▶ Notice the use of the retain statement in order to make sure your sequence variable is assigned the proper value for each iteration through the dataset.
- ▶ This code also introduced the put statement, which is a simple way to write messages or variable values out in the LOG. In this case, the put statement writes out to the LOG how make types of each make happen to exist in the original work.cars2 dataset.
- ▶ A SAS programmer can make use of the put statement as a simple way to help them debug the data step code while in the process of writing it:

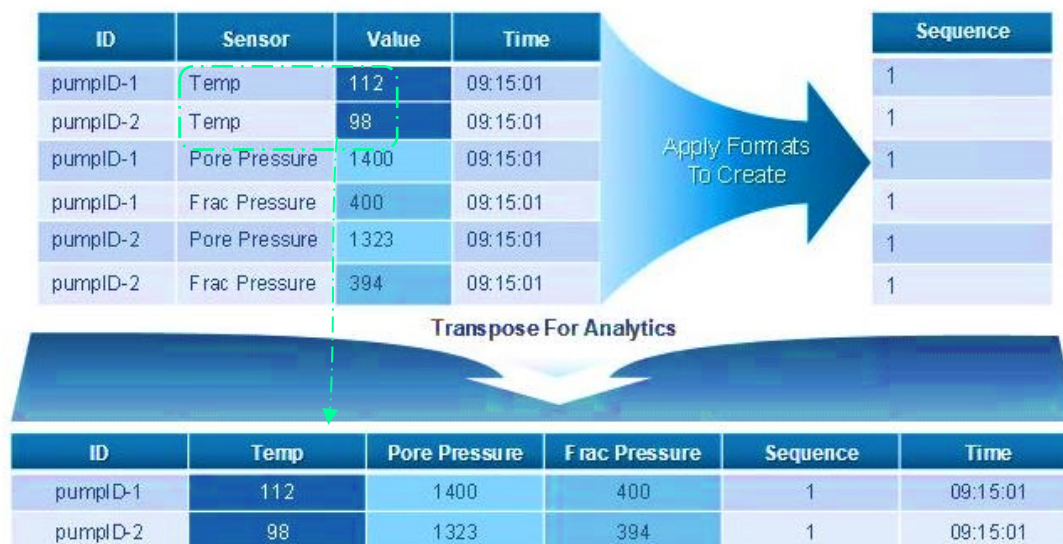
CODE	LOG	RESULTS	OUTPUT DATA
<div> <div> Errors, Warnings, Notes </div> <div> <div>Errors</div> <div>Warnings</div> <div>Notes (3)</div> </div> </div>			
1	OPTIONS NONOTES NOSTIMER NOSOURCE NOSYNTAXCHECK;		
68			
69	data work.CarsNAME;		
70	set work.cars2;		
71	by Make;		
72	if FIRST.Make then sequence=1;		
73	else sequence=sequence+1;		
74	retain sequence;		
75	if LAST.Make then put "There are " sequence "of " make;		
76	run;		
	There are 7 of Acura		
	There are 19 of Audi		
	There are 28 of BMW		
	There are 9 of Buick		
	There are 8 of Cadillac		
	There are 27 of Chevrolet		
	There are 15 of Chrysler		
	There are 13 of Dodge		
	There are 23 of Ford		
	There are 8 of GMC		
	There are 17 of Honda		
	There are 1 of Hummer		
	There are 12 of Hyundai		
	There are 8 of Infiniti		
	There are 2 of Isuzu		
	There are 12 of Jaguar		
	There are 3 of Jeep		
	There are 11 of Kia		
	There are 3 of Land Rover		
	There are 11 of Lexus		
	There are 9 of Lincoln		
	There are 2 of MINI		
	There are 11 of Mazda		
	There are 26 of Mercedes-Benz		
	There are 9 of Mercury		
	There are 13 of Mitsubishi		
	There are 17 of Nissan		
	There are 3 of Oldsmobile		
	There are 11 of Pontiac		

- f. Now go to the OUTPUT DATA tab and once again scroll the table preview all the way to the right so that you can see the sequence variable added. See that it has been added correctly by restarting at 1 for each new make the program encounters in reading the work.cars2 dataset.
- g. **Print it out your output result as shown on Output figure B with name file "IS-429 Lab Week#7B results"**

➡ **Save your code to "IS-429 Lab Week#7B NIM Name.sas"**

3. Transposing the rows and columns in a table

- ▶ **Transposing variables (columns) into observations (rows)** is a task when preparing data for analytics.
- ▶ In data step or other languages, it can take quite a lot of code as well as processing time to get the results
- ▶ An example of data transposition to prepare analytics can be illustrated as follows:



- ▶ Above example provided the actually combines the power of using formats along with transposition in order to get the data in the proper format for analytics to be applied.
- ▶ In this case, a custom format based on the time stamp associated with the various pumps would be created in order to align the data up in the sequence of events that are being captured at different times throughout the day.
- ▶ Notice how the resulting table at the bottom lines up the entity, in this case pumps, in such a way that all the data or attributes associated with individual pumps are in one row per pump per sequence number.
- ▶ Furthermore, PROC TRANSPOSE has been re-engineered over the years to take advantage of the hardware and memory of the environment it is running on, whether it is a Symmetrical Multiprocessing (SMP) based server or hardware, such as the Massively Parallel Processing (MPP) based database or Hadoop data storage platform.
- ▶ PROC TRANSPOSE restructures the of an input data table into an output data table by transposing selected columns (or variables) into rows (or observations). PROC TRANSPOSE can perform both simple transpositions of columns into rows or complex transpositions that involve transposing with by groups and/or renaming transposed columns.

a. Type the following code in a program section of SAS Studio and submit it:

```
/* Week#7C */
proc transpose data=sashelp.failure
    out=work.failure_transposed(drop=_NAME_);
    id cause;
    by process day;
quit;
```

What the above codes do:

SAS Table Properties

General Columns Extended Attributes Column Extended Attributes

Name: FAILURE
 Description: MOS Capacitor Failure
 Type: Table
 Location: SASHELP.FAILURE
 Rows: 70
 Columns: 4
 Date created: Oct 25, 2018, 9:21:29 AM
 Date modified: Oct 25, 2018, 9:21:29 AM

Column Name	Type	Length	Format	Informat	Label
CAUSE	Char	14			Cause of Failure
PROCESS	Char	9			
COUNT	Numeric	8			
DAY	Numeric	8	DOWNNAME.		

NOTE: There were 70 observations read from the data set SASHELP.FAILURE.
 NOTE: The data set WORK.NIMNAME_TRANSPOSED has 10 observations and 9 variables.
 NOTE: PROCEDURE TRANSPOSE used (Total process time):
 real time 0.00 seconds
 user cpu time 0.00 seconds
 system cpu time 0.01 seconds
 memory 2700.21k
 OS Memory 27048.00k
 Timestamp 02/25/2022 04:11:05 PM
 Step Count 30 Switch Count 4
 Page Faults 0
 Page Reclaims 233
 Page Swaps 0
 Voluntary Context Switches 18
 Involuntary Context Switches 0
 Block Input Operations 0
 Block Output Operations 528

Transposed

CODE LOG RESULTS **OUTPUT DATA**

Table: WORK.NIMNAME_TRANSPOSED View: Column names Filter: (none)

Columns Total rows: 10 Total columns: 9 Rows 1-10

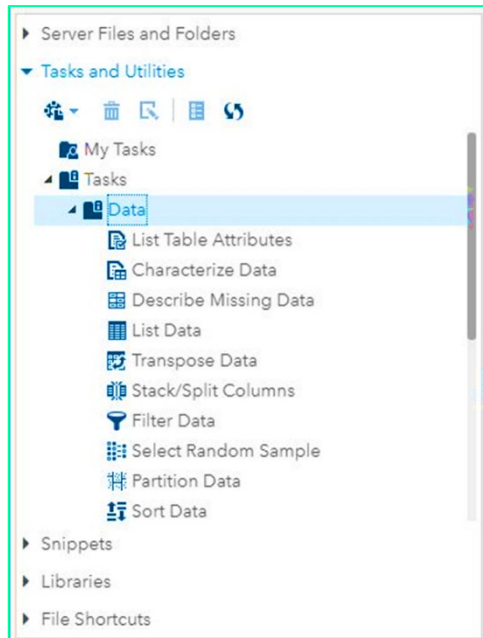
Process	Day	Contamination	Corrosion	Doping
1 Process A	Monday	15	2	1
2 Process A	Tuesday	16	3	1
3 Process A	Wednesday	20	1	1
4 Process A	Thursday	12	1	1
5 Process A	Friday	23	1	1
6 Process B	Monday	8	2	1
7 Process B	Tuesday	9	0	1
8 Process B	Wednesday	4	1	1
9 Process B	Thursday	2	2	1
10 Process B	Friday	1	3	1

- As shown in the above screenshot, look how **little code is needed to be written using PROC TRANSPOSE** to easily rearrange the data within a table in order to view information much more clearly.

Next, is **another way** to do the same transpose **using the TASK function** available in SAS Studio which **will generate the program code** for you.

SAS Studio Transpose Data task

- ▶ SAS Studio also provides a task that generates the necessary code, including PROC TRANSPOSE. In the left of SAS Studio, expand Tasks and Utilities; then expand Tasks and Data so that you can see the list of Data tasks:



- Now double-click on the Transpose Data task, which will open up a program section on the right-hand side of SAS Studio. In the Data drop-down box, select **SASHELP.FAILURE**.
- On the left of your workbench select the **"Data"** tab:
 - Under **ROLES**, assign the **Count** column;
 - then expand **ADDITIONAL ROLES** and add **Process** and **Day**.
- Now select the **OPTIONS** tab :
 - Uncheck** the **Use prefix** checkbox.
 - Check** the **Select a variable that contains the names of the new variables** box and add **Cause**.
- Return to the **DATA** tab in the left-hand-side section and scroll all the way to the bottom:
 - Check** the **Show output data** box.
 - Give your Data Set name **output** as **"work.NIMNAME_Transposed"**
- Now **submit the code** by selecting the running man icon. Since we checked **Show output data**, a **PROC PRINT** was added to the generated code and shows this in the **RESULTS** tab.
- On Output figure C the Transpose task example **provides the exact same transposed results** as the **previous example** using **PROC TRANSPOSE** code.
- Print it out your output result as shown on Output figure C as name file "IS-429 Lab Week#7C results"**

➡ **Save the code given as "IS-429 Lab Week#7C NIM Name"**

4. Statistical and mathematical data transformations

Data scientists and analysts not only want to transpose data within tables, but also tend to **enrich the data with statistics related** to the existing numeric within the table. SAS again makes this enrichment easy with procedures, for example, PROC MEANS.

PROC MEANS

- ▶ The MEANS procedure provides summarization **tools to descriptive statistics** for variables across all observations and within groups of observations. For example, PROC MEANS does the following:
 - Calculates **descriptive statistics based on moments**
 - Estimates quantiles, which includes the **median**
 - Calculates confidence limits for the **mean**
 - Identifies **extreme values**
 - Performs a **t test**
- ▶ The following example of PROC MEANS will continue to use the work.failure_transposed dataset that was produced using the prior PROC TRANSPOSE example.

h. Type it on and submitted these below codes and **save it on to IS-429 Lab Week#7D NIM Name:**

```
/* Week#7D yourNIM and Name */
proc transpose data=sashelp.failure
               out=work.nimname_transposed(drop=_NAME_);
               id cause;
               by process day;
quit;

proc means data=work.nimname_transposed n mean max min Q1 median Q3 std;
  class Process;
quit;
```

- i. Submitting the above code will produce the output in the RESULTS tab as Output Figure D.
- i. **Print it out your output result as shown on Output figure D as name file "IS-429 Lab Week#7D results"**

❖ Finally, today's practicum is over, **collect your pdf file and all code programs into "IS-429 Week#7 NIM yourName.zip"** and submit immediately today to e-Learning IS-429 Practicum Week#7.

RESULTS/ OUTPUT

A. Referencing external files: explore and load the CLIENT_INFO table

2/25/22, 12:57 AM

Results: WORK.YOURNIMNAME_RAW

Obs	Name	Sex	Age	Height	Weight
1	Alfred	M	14	69.0	112.5
2	Alice	F	13	56.5	84.0
3	Barbara	F	13	65.3	98.0
4	Carol	F	14	62.8	102.5
5	Henry	M	14	63.5	102.5
6	James	M	12	57.3	83.0
7	Jane	F	12	59.8	84.5
8	Janet	F	15	62.5	112.5
9	Jeffrey	M	13	62.5	84.0
10	John	M	12	59.0	99.5
11	Joyce	F	11	51.3	50.5
12	Judy	F	14	64.3	90.0
13	Louise	F	12	56.3	77.0
14	Mary	F	15	66.5	112.0
15	Philip	M	16	72.0	150.0
16	Robert	M	12	64.8	128.0
17	Ronald	M	15	67.0	133.0
18	Thomas	M	11	57.5	85.0
19	William	M	15	66.5	112.0

<https://odamid-apse1.oda.sas.com/SASStudio/sasexec/submissions/f741e2ba-6720-4e90-ae1e-6d1805e545b8/results>

B. Creating indicators for the first and last observation in a by group

Week#7B.pdf - Adobe Acrobat Reader DC (32-bit)

File Edit View Sign Window Help

Home Tools Data Analysis Using...

Week#7B.pdf x

1 / 11 92.4%

2/25/22, 9:24 PM

Results: WORK.CAR^{NIMNAME}

Obs	Make	Model	Type	Origin	DriveTrain	MSRP	Invoice	EngineSize	Cylinders	Horsepower	MPG_City	MPG_Highway	Weight	Wheelbase	Length	sequence
1	Acura	MDX	SUV	Asia	All	\$36,945	\$33,337	3.5	6	265	17	23	4451	106	189	1
2	Acura	RSX Type S 2dr	Sedan	Asia	Front	\$23,820	\$21,761	2.0	4	200	24	31	2778	101	172	2
3	Acura	TSX 4dr	Sedan	Asia	Front	\$26,990	\$24,647	2.4	4	200	22	29	3230	105	183	3
4	Acura	TL 4dr	Sedan	Asia	Front	\$33,195	\$30,299	3.2	6	270	20	28	3575	108	186	4
5	Acura	3.5 RL 4dr	Sedan	Asia	Front	\$43,755	\$39,014	3.5	6	225	18	24	3880	115	197	5
6	Acura	3.5 RL w/Navigation 4dr	Sedan	Asia	Front	\$46,100	\$41,100	3.5	6	225	18	24	3893	115	197	6
7	Acura	NSX coupe 2dr manual S	Sports	Asia	Rear	\$89,765	\$79,978	3.2	6	290	17	24	3153	100	174	7
8	Audi	A4 1.8T 4dr	Sedan	Europe	Front	\$25,940	\$23,508	1.8	4	170	22	31	3252	104	176	1
9	Audi	A4 1.8T convertible 2dr	Sedan	Europe	Front	\$35,940	\$32,508	1.8	4	170	23	30	3638	105	180	2
10	Audi	A4 3.0 4dr	Sedan	Europe	Front	\$31,840	\$28,846	3.0	6	220	20	28	3482	104	179	3
11	Audi	A4 3.0 Quattro 4dr manual	Sedan	Europe	All	\$33,430	\$30,366	3.0	6	220	17	26	3583	104	176	4
12	Audi	A4 3.0 Quattro 4dr auto	Sedan	Europe	All	\$34,480	\$31,388	3.0	6	220	18	25	3627	104	176	5
13	Audi	A6 3.0 4dr	Sedan	Europe	Front	\$36,640	\$33,129	3.0	6	220	20	27	3561	109	192	6
14	Audi	A6 3.0 Quattro 4dr	Sedan	Europe	All	\$39,640	\$35,992	3.0	6	220	18	25	3880	109	192	7
15	Audi	A4 3.0 convertible 2dr	Sedan	Europe	Front	\$42,490	\$38,325	3.0	6	220	20	27	3814	105	180	8
16	Audi	A4 3.0 Quattro convertible 2dr	Sedan	Europe	All	\$44,240	\$40,075	3.0	6	220	18	25	4013	105	180	9
17	Audi	A6 2.7 Turbo Quattro 4dr	Sedan	Europe	All	\$42,840	\$38,840	2.7	6	250	18	25	3836	109	192	10
18	Audi	A6 4.2 Quattro 4dr	Sedan	Europe	All	\$49,690	\$44,936	4.2	8	300	17	24	4024	109	193	11
19	Audi	A8 L Quattro 4dr	Sedan	Europe	All	\$69,190	\$64,740	4.2	8	330	17	24	4399	121	204	12
20	Audi	S4 Quattro 4dr	Sedan	Europe	All	\$48,040	\$43,556	4.2	8	340	14	20	3825	104	176	13
21	Audi	RS 6 4dr	Sports	Europe	Front	\$84,800	\$76,417	4.2	8	450	15	22	4024	109	191	14
22	Audi	TT 1.8 convertible 2dr (coupe)	Sports	Europe	Front	\$35,940	\$32,512	1.8	4	180	20	28	3131	95	159	15
23	Audi	TT 1.8 Quattro 2dr	Sports	Europe	All	\$37,390	\$33,891	1.8	4	225	20	28	2921	96	159	16

C. Transposing the rows and columns in a table

Results_Transpose Data.pdf - Adobe Acrobat Reader DC (32-bit)

File Edit View Sign Window Help

Home Tools Results_Transpose ... x

2/25/22, 11:43 PM Results: Transpose Data

Subset of WORK.NIMNAME_TRANSPOSED

Obs	Process	Day	Contamination	Corrosion	Doping	Metallization	Miscellaneous	Oxide Defect	Silicon Defect
1	Process A	Monday	15	2	1	2	3	8	1
2	Process A	Tuesday	16	3	1	3	1	9	2
3	Process A	Wednesday	20	1	1	0	3	7	2
4	Process A	Thursday	12	1	1	0	0	10	1
5	Process A	Friday	23	1	1	0	1	8	2
6	Process B	Monday	8	2	1	4	2	10	3
7	Process B	Tuesday	9	0	1	2	4	9	2
8	Process B	Wednesday	4	1	1	0	0	10	1
9	Process B	Thursday	2	2	1	0	3	7	1
10	Process B	Friday	1	3	1	0	1	8	2

D. Statistical and mathematical data transformations

Results_IS-429 Lab Week#7D NIM Name.sas.pdf - Adobe Acrobat Reader DC (32-bit)

File Edit View Sign Window Help

Home Tools Results_IS-429 Lab ... x

2/26/22, 1:53 PM Results: IS-429 Lab Week#7D NIM Name.sas

The MEANS Procedure

Process	N Obs	Variable	N	Mean	Maximum	Minimum	Lower Quartile	Median	Upper Quartile	Std Dev
Process A	5	Day	5	17960.00	17962.00	17958.00	17959.00	17960.00	17961.00	1.5811388
		Contamination	5	17.2000000	23.0000000	12.0000000	15.0000000	16.0000000	20.0000000	4.3243497
		Corrosion	5	1.6000000	3.0000000	1.0000000	1.0000000	1.0000000	2.0000000	0.8944272
		Doping	5	1.0000000	1.0000000	1.0000000	1.0000000	1.0000000	1.0000000	0
		Metallization	5	1.0000000	3.0000000	0	0	0	2.0000000	1.4142138
		Miscellaneous	5	1.6000000	3.0000000	0	1.0000000	1.0000000	3.0000000	1.3416408
		Oxide Defect	5	8.4000000	10.0000000	7.0000000	8.0000000	8.0000000	9.0000000	1.1401754
		Silicon Defect	5	1.8000000	2.0000000	1.0000000	1.0000000	2.0000000	2.0000000	0.5477226
Process B	5	Day	5	17960.00	17962.00	17958.00	17959.00	17960.00	17961.00	1.5811388
		Contamination	5	4.8000000	9.0000000	1.0000000	2.0000000	4.0000000	8.0000000	3.5637059
		Corrosion	5	1.6000000	3.0000000	0	1.0000000	2.0000000	2.0000000	1.1401754
		Doping	5	1.0000000	1.0000000	1.0000000	1.0000000	1.0000000	1.0000000	0
		Metallization	5	1.2000000	4.0000000	0	0	0	2.0000000	1.7888544
		Miscellaneous	5	2.0000000	4.0000000	0	1.0000000	2.0000000	3.0000000	1.5811388
		Oxide Defect	5	8.8000000	10.0000000	7.0000000	8.0000000	9.0000000	10.0000000	1.3038405
		Silicon Defect	5	1.8000000	3.0000000	1.0000000	1.0000000	2.0000000	2.0000000	0.8366600

The End

REFERENCE

1. Anna Yarbrough. 2020. Introduction to Data Curation for SAS® Data Scientists Course Notes. SAS Institute Inc. Cary, NC, USA.
2. SAS Institute Inc. 2020. SAS® Viya® Programming: Getting Started. SAS Institute Inc. Cary, NC, USA.
3. SAS Institute Inc. 2019. Exploring SAS® Viya®: Programming and Data Management. SAS Institute Inc. Cary, NC, USA.
4. [SAS® Support | Documentation](#)
5. Other additional references are excerpts from various Online Learning/websites.