Factors influencing Comfort measured and modelled

webinar on main results of the ComfDemo project – 23 nov 2022 recordings of turboprop flights







This project has received funding from the Clean Sky 2 Joint Undertaking (JU) under grant agreement No 831992. The JU receives support from the European Union's Horizon 2020 research and innovation programme and the Clean Sky 2 JU members other than the Union.

Program

14:00 Opening (Dr. Victor Norrefeldt, Fraunhofer IBP)

14:05 Interactive start: attendees share issues in turboprop flying

14:10 Overview: aircraft interior priorities based on passengers' opinions (Prof. Dr. Peter Vink, vhp Human Performance)

14:20 Inflight questionnaire results (*Prof. Dr. Britta Herbig, Ludwig-Maximilians-Universität München*)

14:30 The jacket results recording CO2, temp, humidity, acceleration etc (Dr. Y. (Wolf) Song, TU-Delft)

14:40 Interaction between attendees and speakers on webinar so far + discussion

15:00 Break

15:10 Results of measurements in the turboprop (*Dr. Michael Bellmann, itap GmbH*)

15:20 Vibration and noise in the flight and the lab (*Prof. Dr. Neil Mansfield, Nottingham Trent University*)

15:30 Experiencing noise cancelling headphones, earplugs in turboprops (Gerbera Vledder, TU-Delft)

15:40 A comfort model based on flight data (*Prof. Neil Mansfield, Prof. Dr. Britta Herbig*)

16:00 Interaction between attendees and speakers on webinar, questions + discussion

16:30 closing

Topic leader: COMFDEMO partners:













Opening

Dr. Victor Norrefeldt, Fraunhofer IBP









Interactive start

Attendees share issues in turboprop flying









Aircraft interior priorities based on passengers' opinions

Prof. Dr. Peter Vink, vhp Human Performance





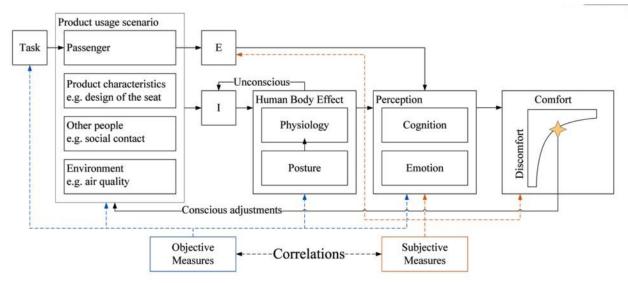




ComfDemo (cleansky2)

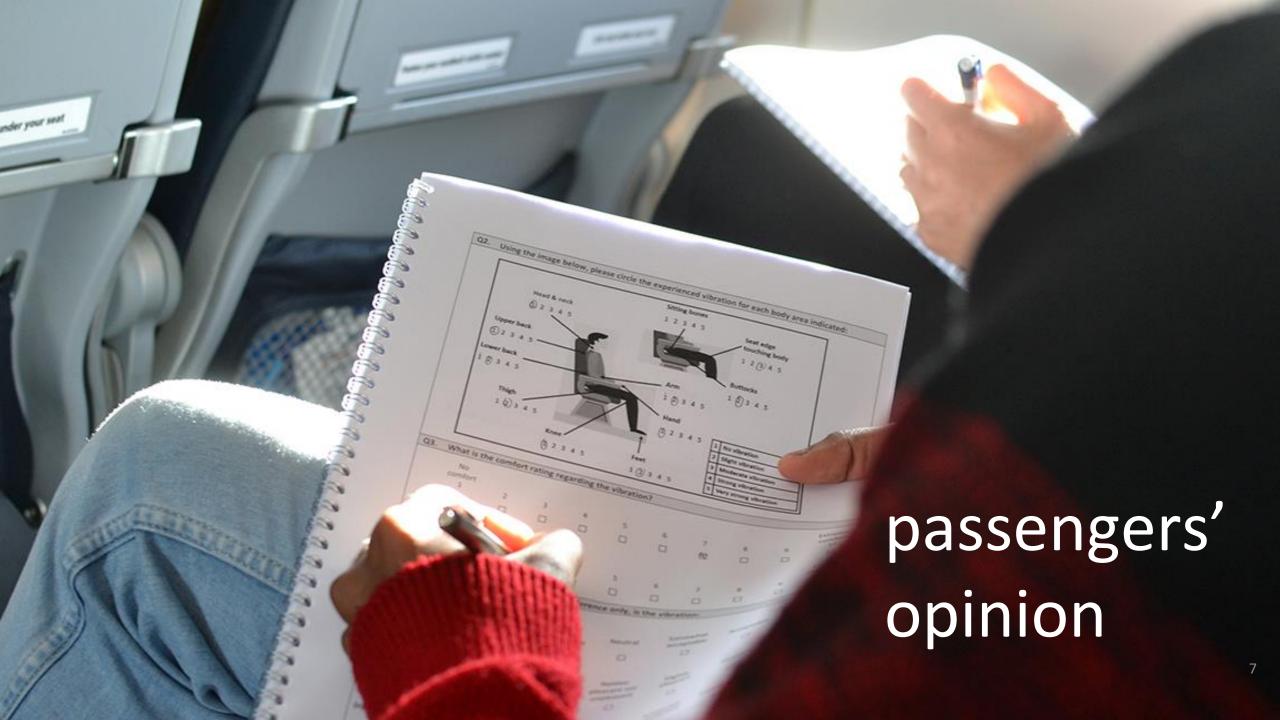
• Digital twin (comfort model):

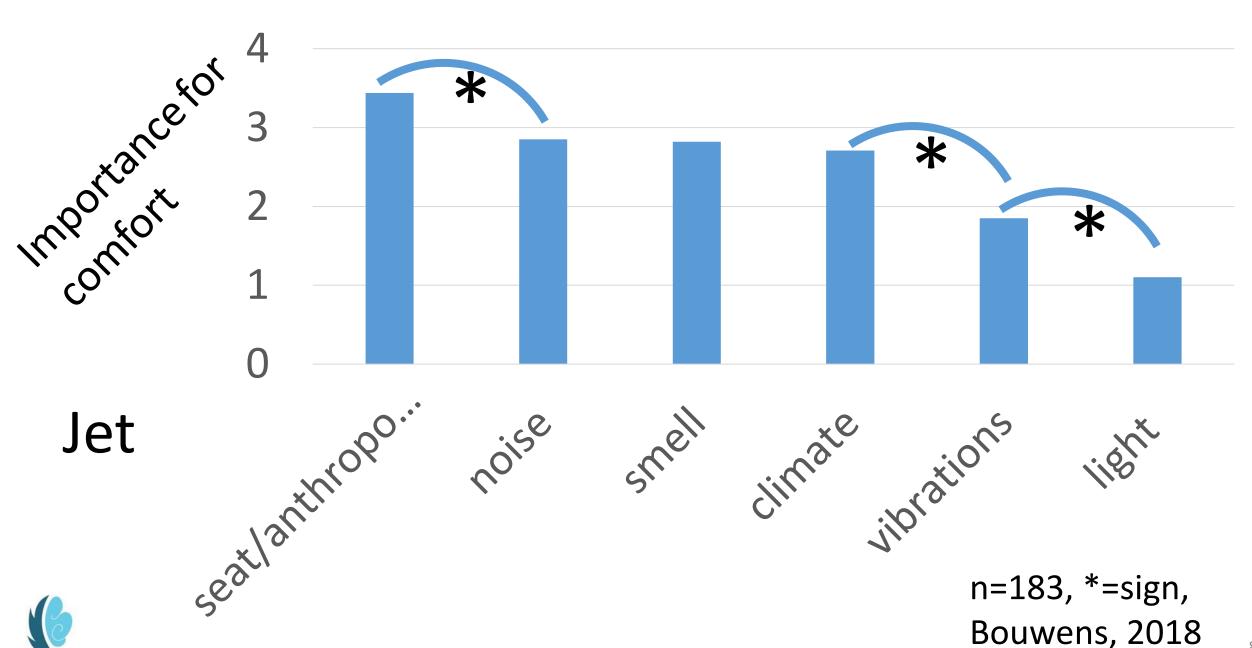
• Test protocol for Demonstrator:

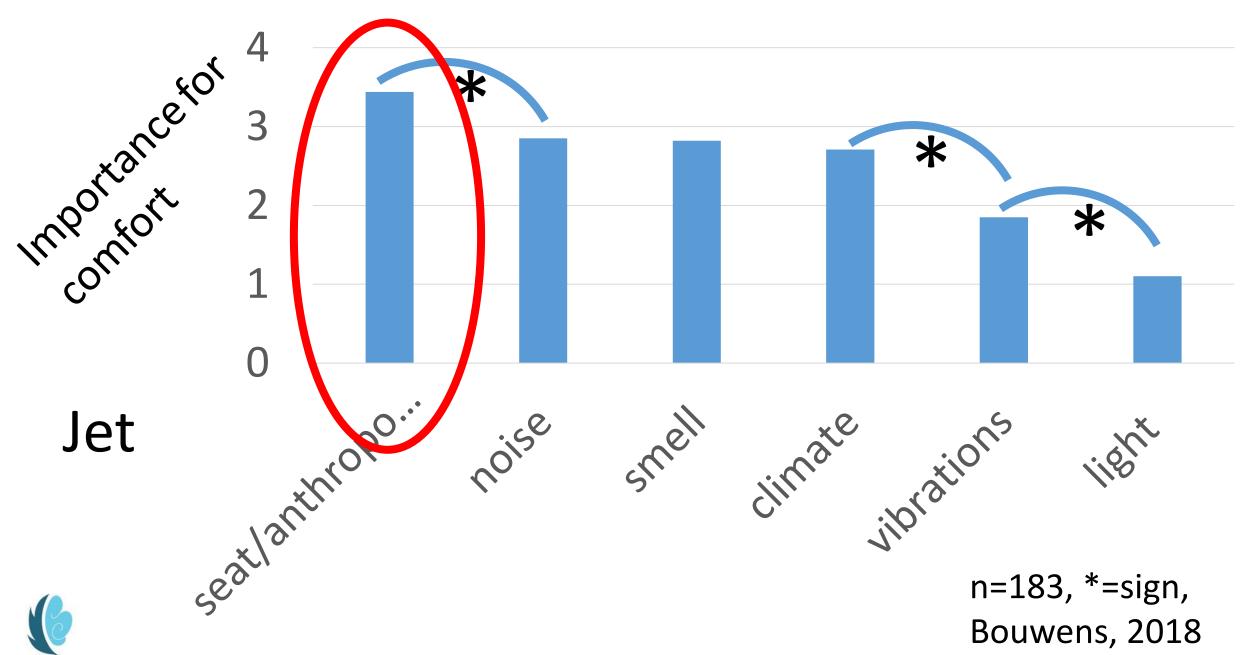




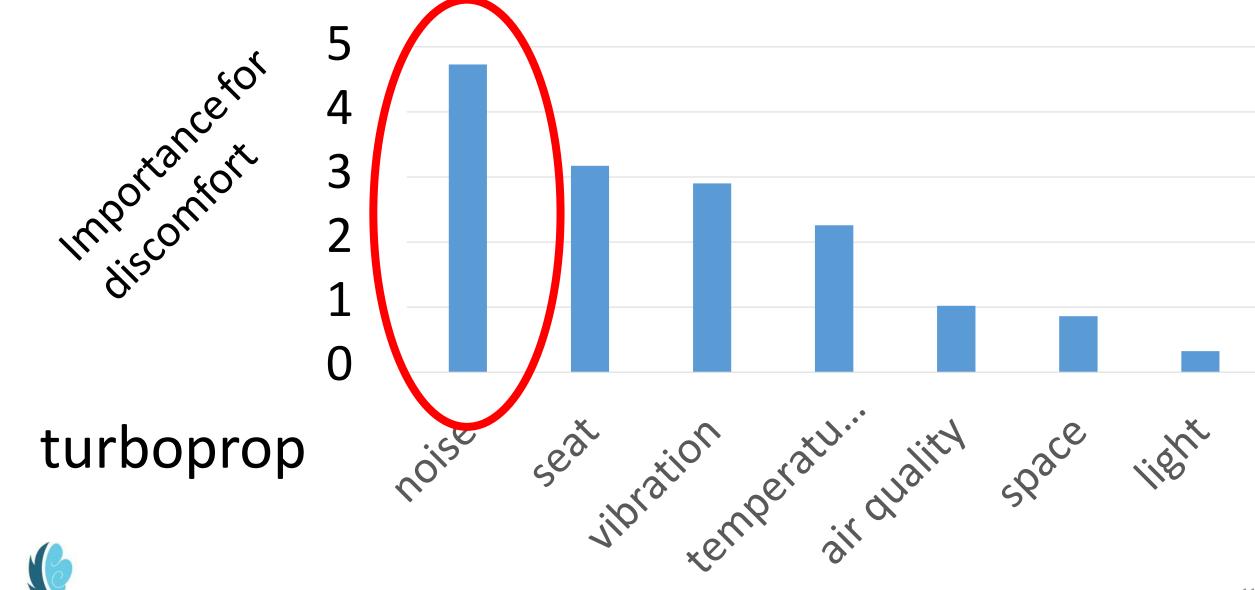


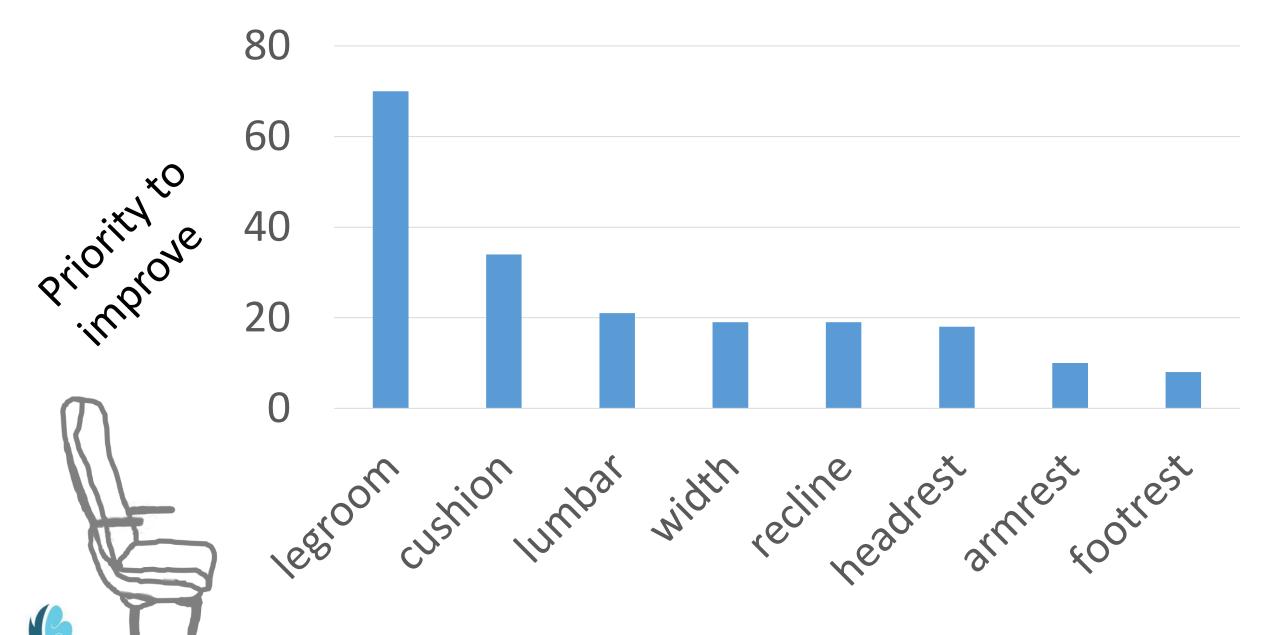






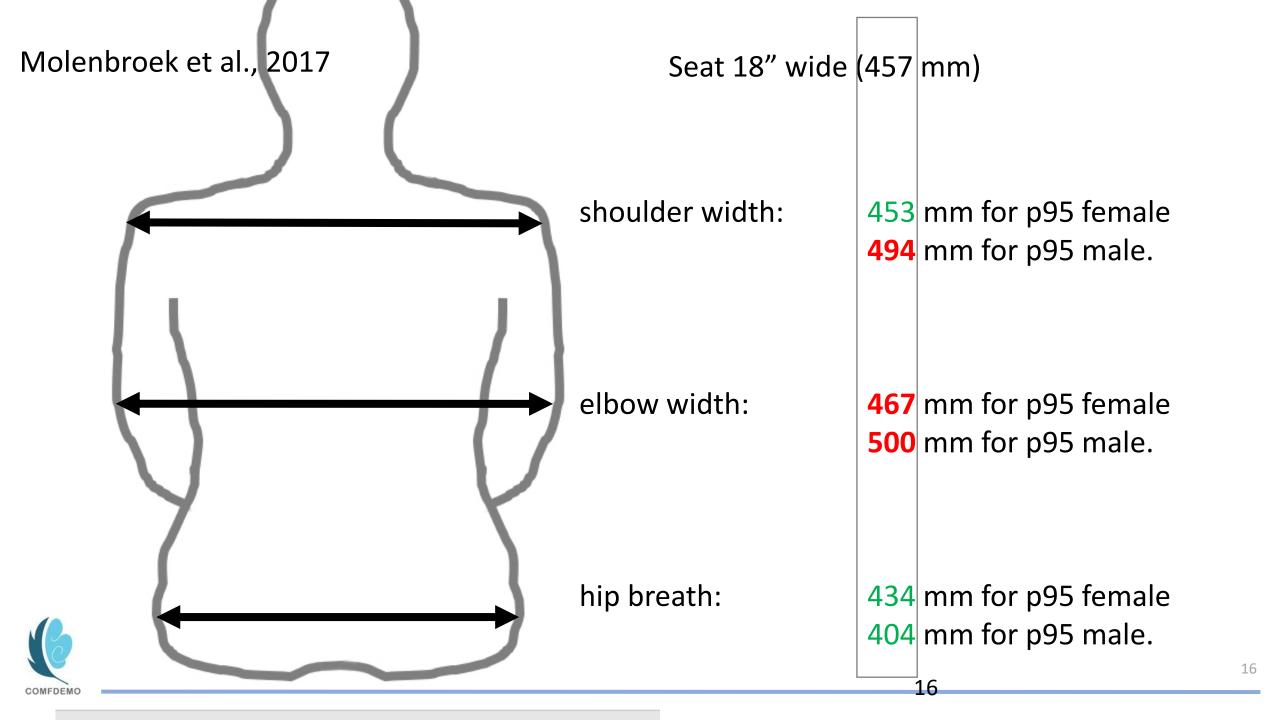












Summary:

Propeller aircraft have potential (sustainable)

Comfdemo: digital model and protocol for tests in a Demonstrator

For protocol attention is needed for:

- Noise
- Seat dimensions (esp seat width)
- Vibration

This is all relevant for future propeller airplanes



Summary:

Propeller aircraft have potential (sustainable)

Comfdemo: digital model and protocol for tests in a Demonstrator

For protocol attention is needed for:

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- Seat dimensions (esp seat width)
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This is all relevant for future propeller airplanes



Inflight questionnaire results

Prof. Dr. Britta Herbig, Ludwig-Maximilians-Universität München











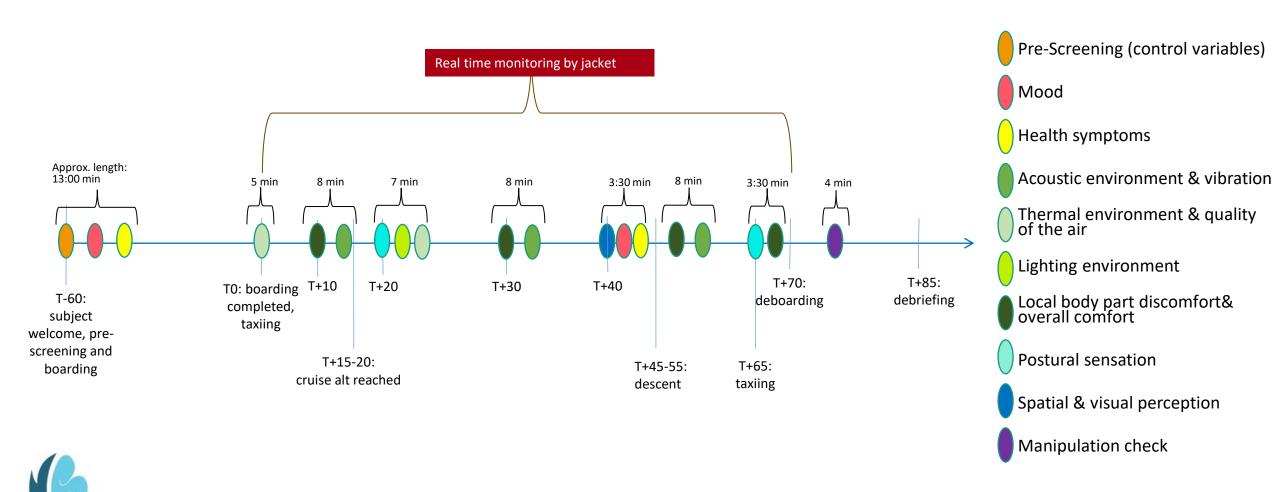






Sequence of questionnaire parts

COMFDEMO

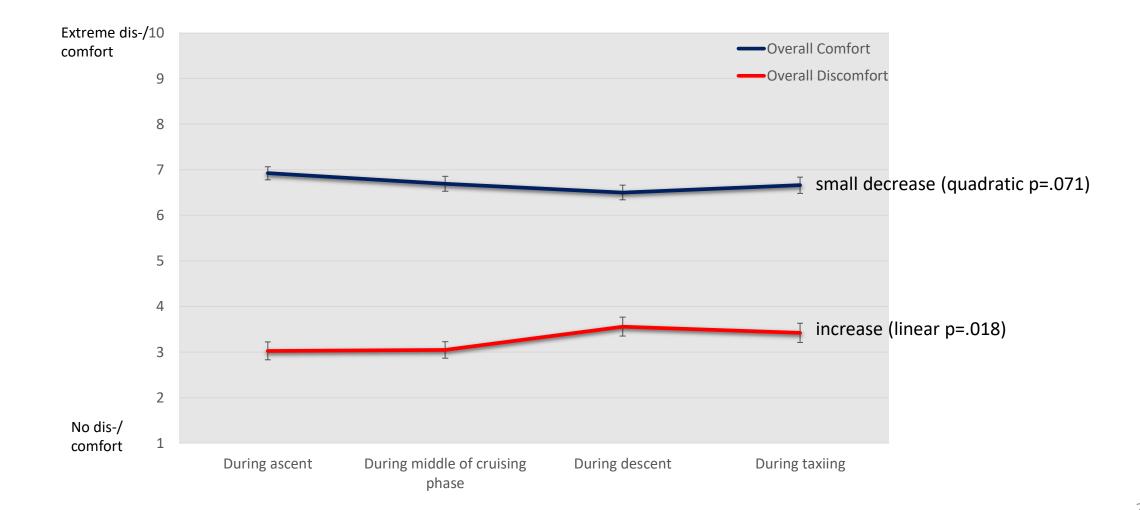


Sample Characteristics

- Overall, 94 participants (3 participants were excluded)
- 58 men and 36 women
- Mean age 33.86 ± 14.31 years
- Mean BMI 23.60 \pm 3.24
- Experience travelling in a turboprop aircraft:
 - 53.3% yes
 - 32.2% no
 - 14.4% did not know
- Majority of participants indicated a positive attitude towards flying (M = 5.89, SD = 1.26)

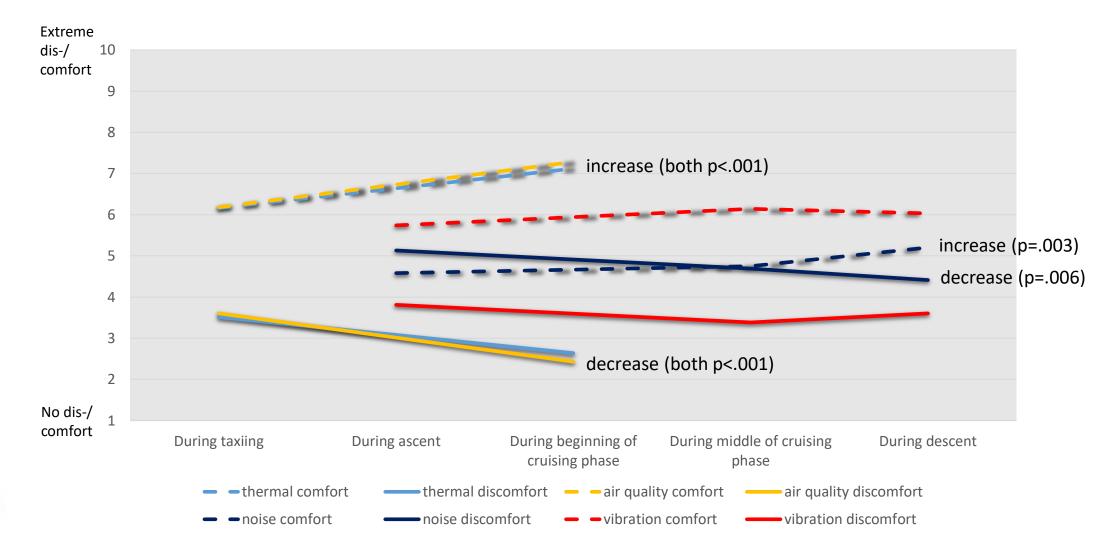


Overall Dis-/Comfort Rating over time



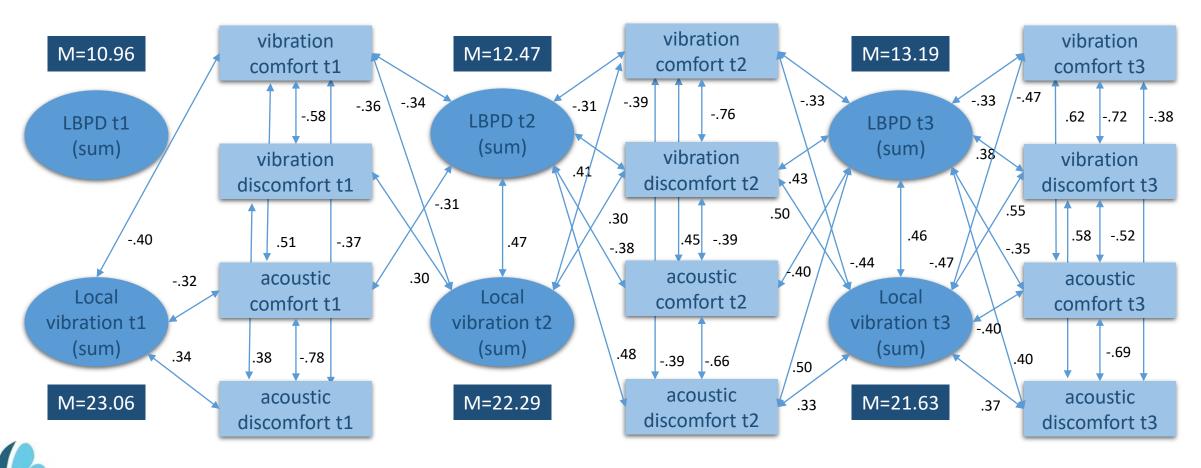


Dis-/comfort: Environmental parameters over time





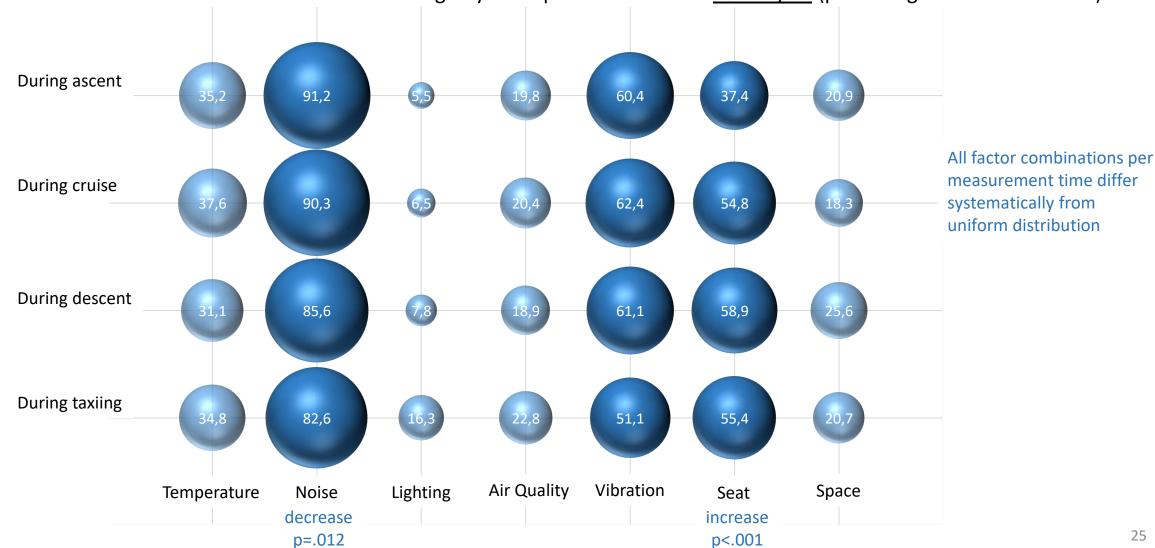
Acoustics and Vibration: Associations to local body part discomfort (LBPD) and vibration experience





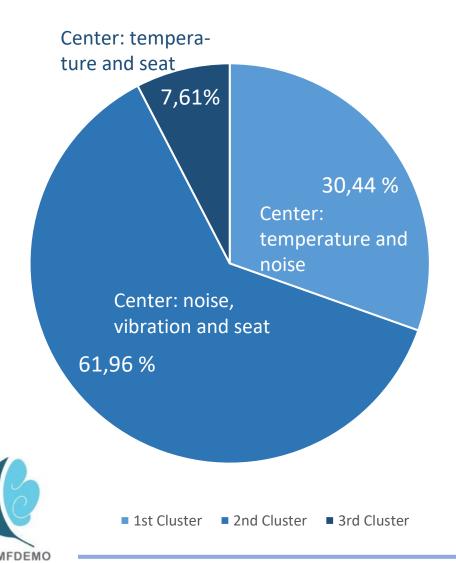
Discomfort Factors

Please mark the *three* factors most contributing to your experienced level of <u>discomfort</u> (percentage of ticked answers):





Cluster of Overall Discomfort Factors



Person-related control variables in clusters

No differences regarding:

- Age, sex, anthropometrics, BMI
- Flight attitude, turboprop experience, negative affectivity
- Flight, row

Differences regarding:

- Flight experience (number of flights):
 Cluster 1 (3,11) less experienced than
 cluster 2 (8,43)
- Noise sensitivity (mean1-5): Cluster 1
 (2,43) less sensitive than cluster 2 (2,83)

Discomfort factor	Overall after deboarding
Temperature	34 (37.0%)
Noise	84 (91.3%)
Lighting	8 (8.7%)
Air quality	18 (19.6%)
Vibration	58 (63.0%)
Seat	49 (53.3%)
Space	17 (18.5%)

Decision to Fly again with Turboprop Aircraft

Would you consider flying with this type of aircraft	YES	NO	n
again?	N=80	N=11	р
Flight experience (# flights in 2019)	6,68	7,45	.050*
General environmental sensitivity	8,59	11,55	.021*
Discomfort regarding acoustic environment ascent	4,94	7,09	.003**
Discomfort regarding acoustic environment cruise	4,47	6,27	.017*
Discomfort regarding acoustic environment descent	4,28	6,09	.016*
Discomfort regarding vibration cruise	3,10	5,64	.000***
Discomfort regarding vibration descent	3,32	5,91	.000***
Local vibration during ascent (bodily sensations)	23,0	27,13	.029*
Local vibration during descent (bodily sensations)	14,67	26,64	.033*



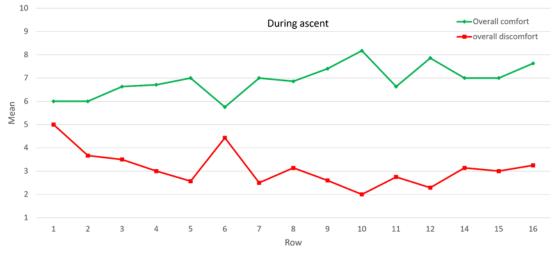
No differences regarding light-, spatial-, postural-, air quality- or thermal discomfort, noise sensitivity and other attitudes, health symptoms, local body part discomfort, flight or row

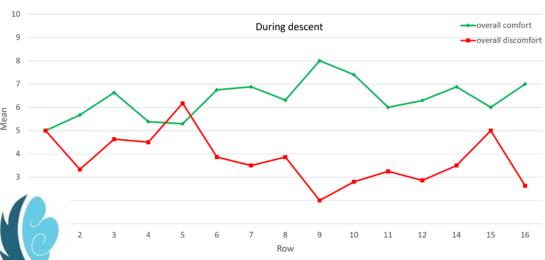
Summary

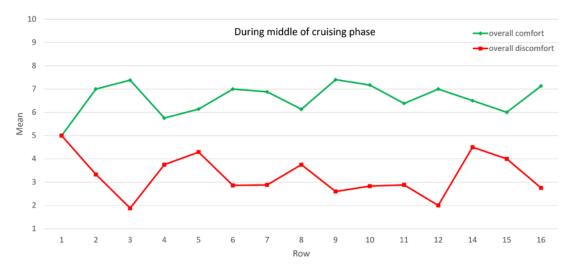
- In general, people felt rather comfortable (although decreasing over time) and would fly again with turboprop aircrafts (85.1%)
- Noise, vibration and seat are the dominant discomfort factors for most participants across all flight phases
- Levels of noise and vibration related discomfort are also the ones discriminating between participants who would fly again with turboprop and who would not
- Development of comfort and discomfort experience over bodily sensations in turboprop aircrafts seem to have a rather complex conditional structure → Challenge for modelling

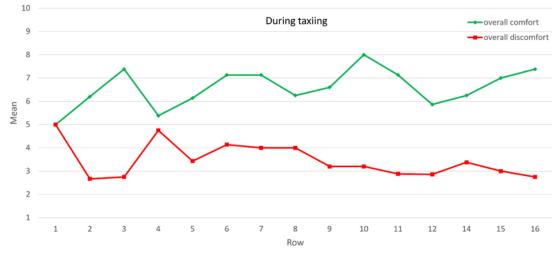


Overall Dis-/Comfort Rating stratification







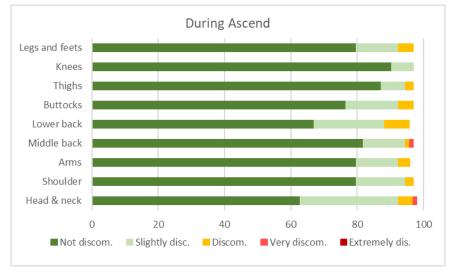


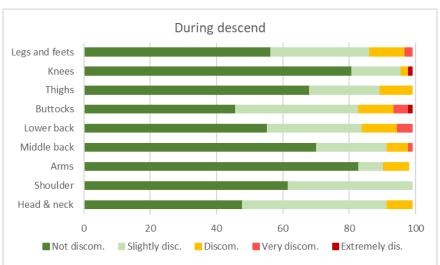
Prediction of flight pleasantness at end of flight

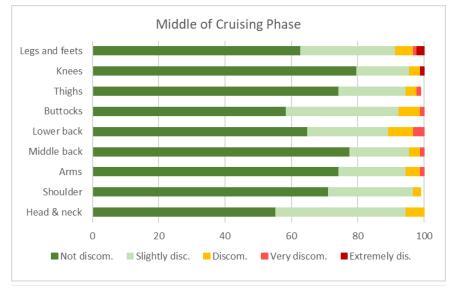
Dependent Variable: How pleasant was this flight?	N predictors	R ²	ΔR^2	β
Sociodemographics and anthropometry	8			
sex		.035+	.035+	187+
Psychological "Make-Up" (Attitudes, Fears, Affect)	10			
positive flight attitude		.051*	.051*	.226*
Experienced discomfort during Flight	24			
vibration during descent		.116**	.116**	341**
thermal factor during whole flight		.184***	.068*	265*
general discomfort during ascent		.220***	.036+	201+
vibration during ascent		.267***	.047*	.259*
Physical "complaints"	44			
local discomfort in middle back during descent		.164***	.164***	405***
local discomfort in head & neck during cruising phase		.216***	.052`*	227*

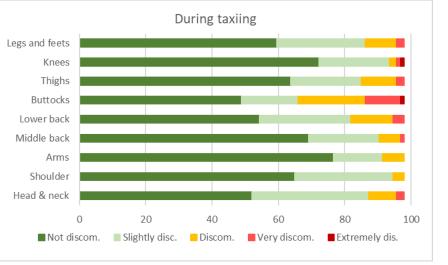


Local Body Part Discomfort – Frequency of answers %













Digital twin of comfort: Modelling passengers' comfort experience

Dr. Y. Song, TU-Delft







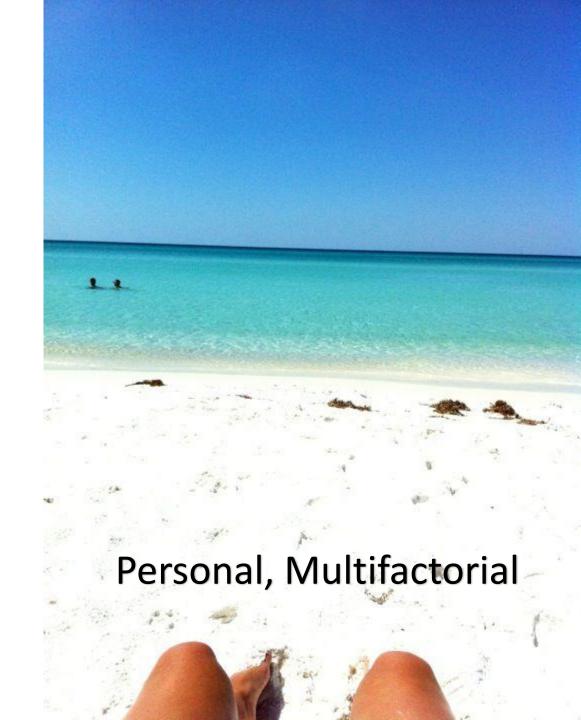


Experiencing comfort

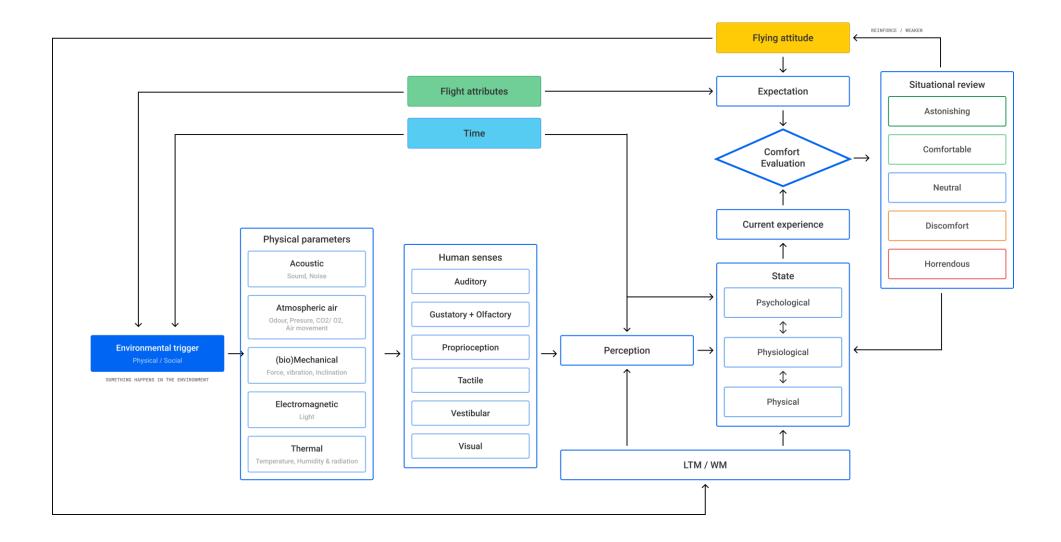
A product in itself can never be comfortable.

The **user** decides whether or not a product is **comfortable**, or leads to **discomfort**, by using the product.

Mansfield, N., Naddeo, A., Frohriep, S., & Vink, P. (2020). Integrating and applying models of comfort. Applied Ergonomics, 82(May 2019), 102917.

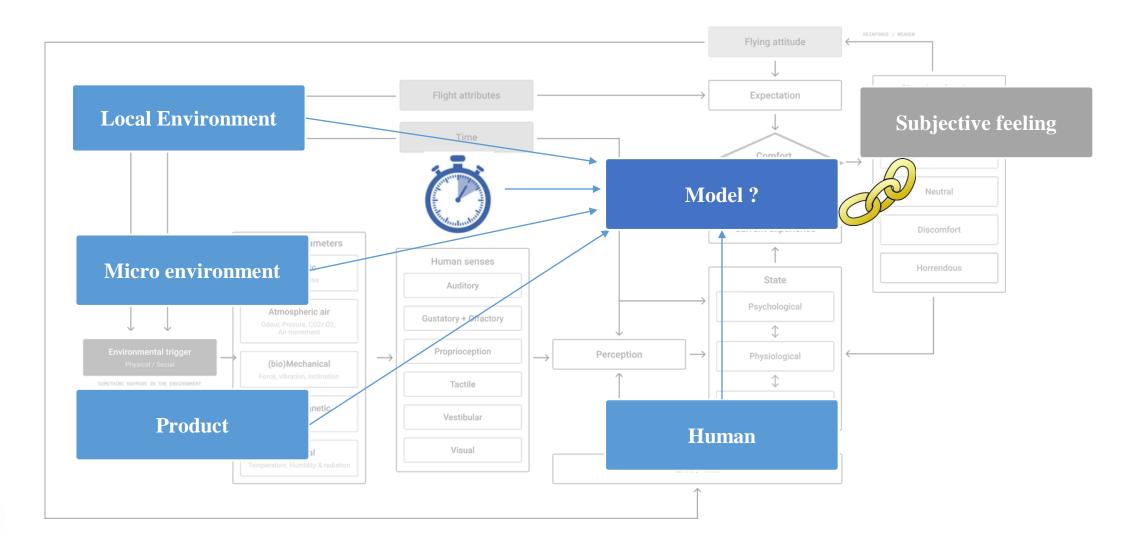


An example of qualitative comfort models





Factors in the qualitative comfort model





Highlighted measurable factors – 32 parameters



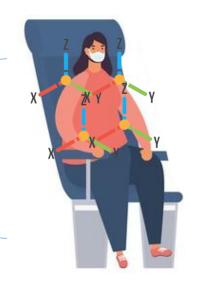
Noise

Co2



Humidity Temperature Red light intensity Orange light intensity Yellow light intensity Green light intensity Blue light intensity

Violet intensity



Gender

Age

Buttock popliteal depth

Human

Product

Flying time Row Seat Flight scheduled time







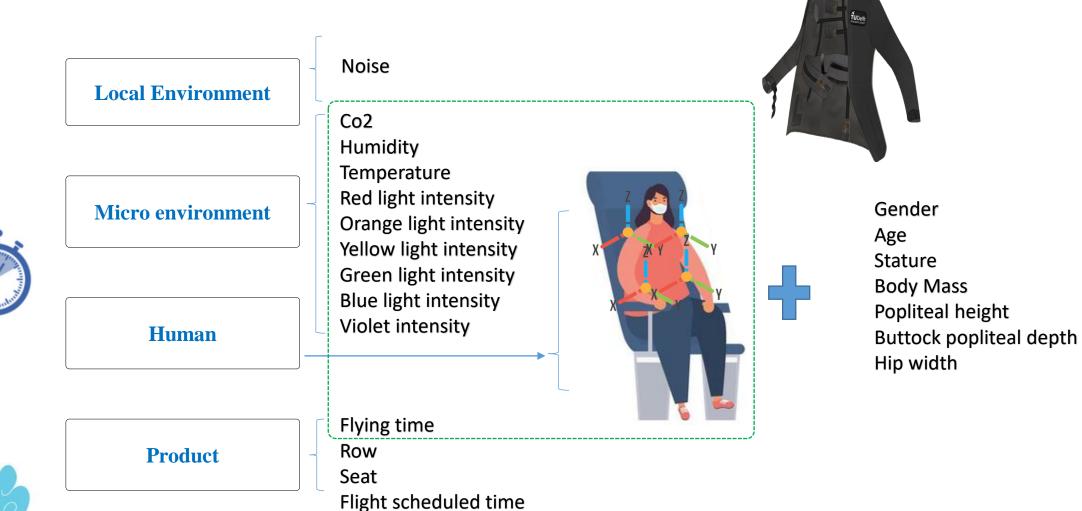
Stature

Body Mass

Popliteal height

Hip width

Highlighted measurable factors – 32 parameters

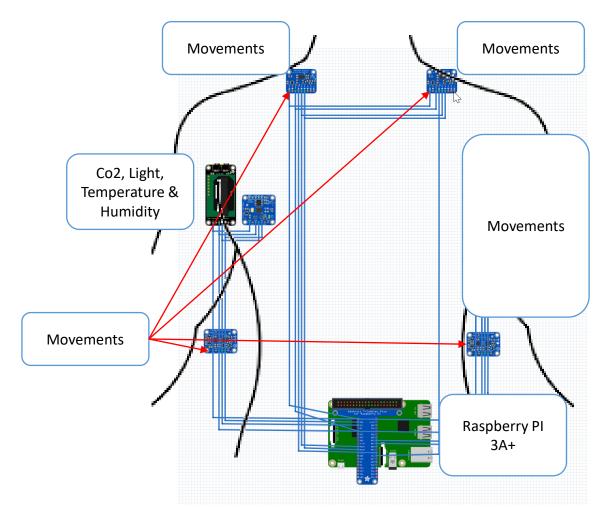




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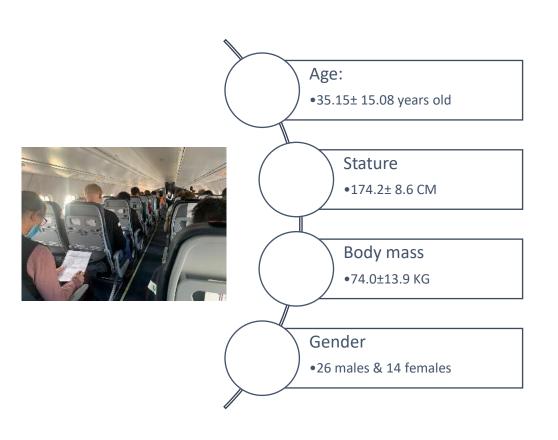
Wearable Jacket: An integrated comfort measurement tool

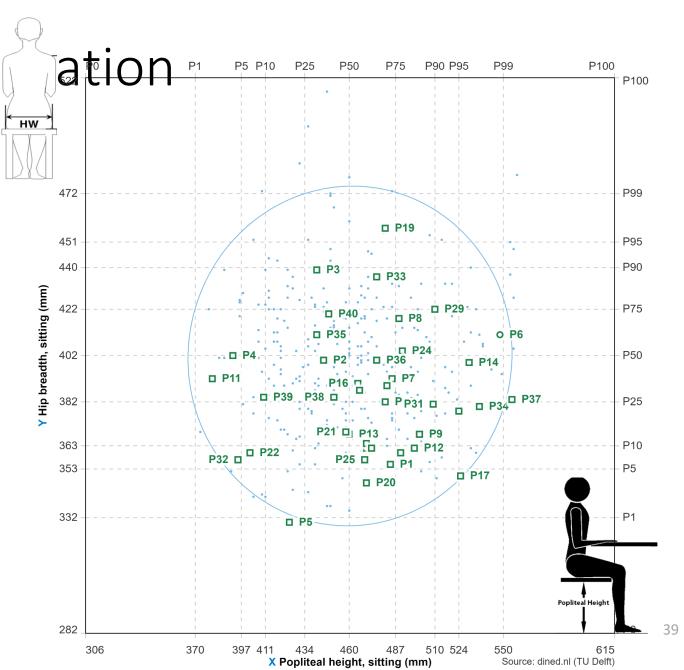






A representative por

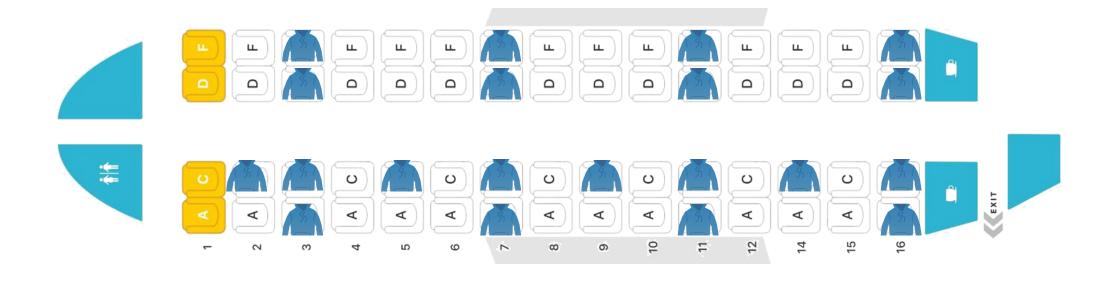




Cabin layout & location of Jackets









Data example -- CO2 levels



First attempt of a quantitative comfort model

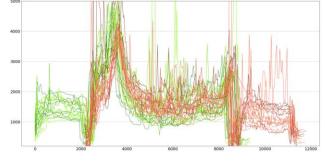
397 411 434 460 487 510 504 550 515 X Popitasi height, sitting (mm) Source deed.ni (TU Deft)

Human, e.g. movements, anthropometry measures

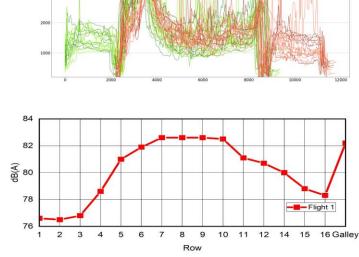
Product, e.g. rows of the seat



Micro environment, e.g. co2 level



Local environment, e.g. noise level



Questionnaire





Modelling tool



Hypothesis & Data pre-processing

In the first attempt, we use the changes of comfort /discomfort, as the baseline differs per person

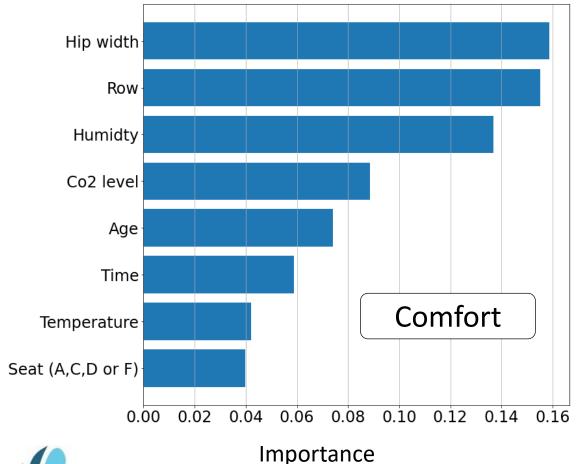
60s were set as the time unit

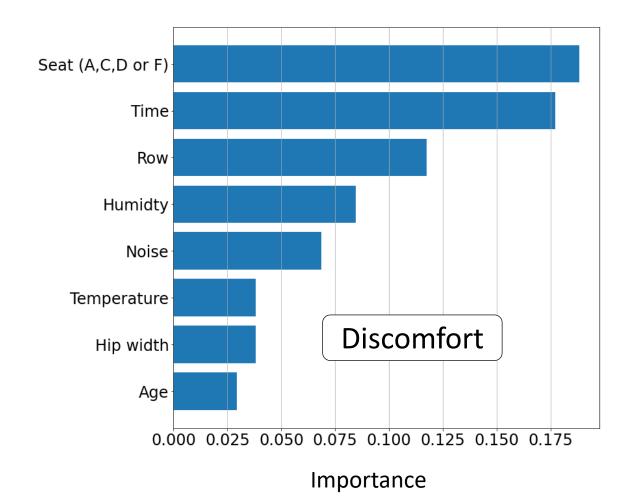
Data augmentation: we linearly interpolate the comfort/discomfort scores

All data is normalized to the range of $0 \sim 1$ where the minimum is 0 and the maximum is 1



First attempt: The importance of factors regarding comfort & discomfort





Summary:

The preliminary results show that we are able to make a step towards modelling human comfort experience using Jacket data

Anthropometry, seat positions, time, humidity, CO2, temperature and noise are leading factors that influence the feeling of comfort/discomfort

Limitations

Noise and vibration in micro environment were not included in the model

In Lubeck air, the seat pitch was 34 inch, which might influence the importance of other anthropometric measures, e.g. stature

Future works

More data on different types of seat layouts and airplanes

Advanced modelling tools with in-depth explanation of different factors



Interaction and Questions

Interaction between attendees and speakers on webinar so far + discussion









Coffee Break









In-flight measurement of sound and vibration inside the cabin

Aenne Euhus, Adrian May, Dr. Michael Bellmann itap GmbH









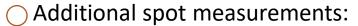
Flight situation and measurement positions

Nov. 3rd 2022: 3 flights (1st and 2nd flight with PAX; 3rd flight without PAX) in ATR72-500:

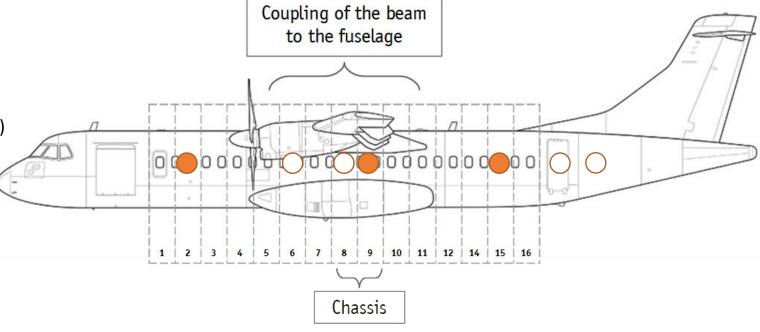
Measurement positions of noise and vibrations

Continuous measurements in row 2 & 15:

Continous measurements row 9 (only 3rd flight)



- around the coupling area of the beam to the fuselage (row 6-8)
- around the galley
- in the toilet (incl. flushing)



Due to technical defect there is no data avaiable for:

vibration x-axis

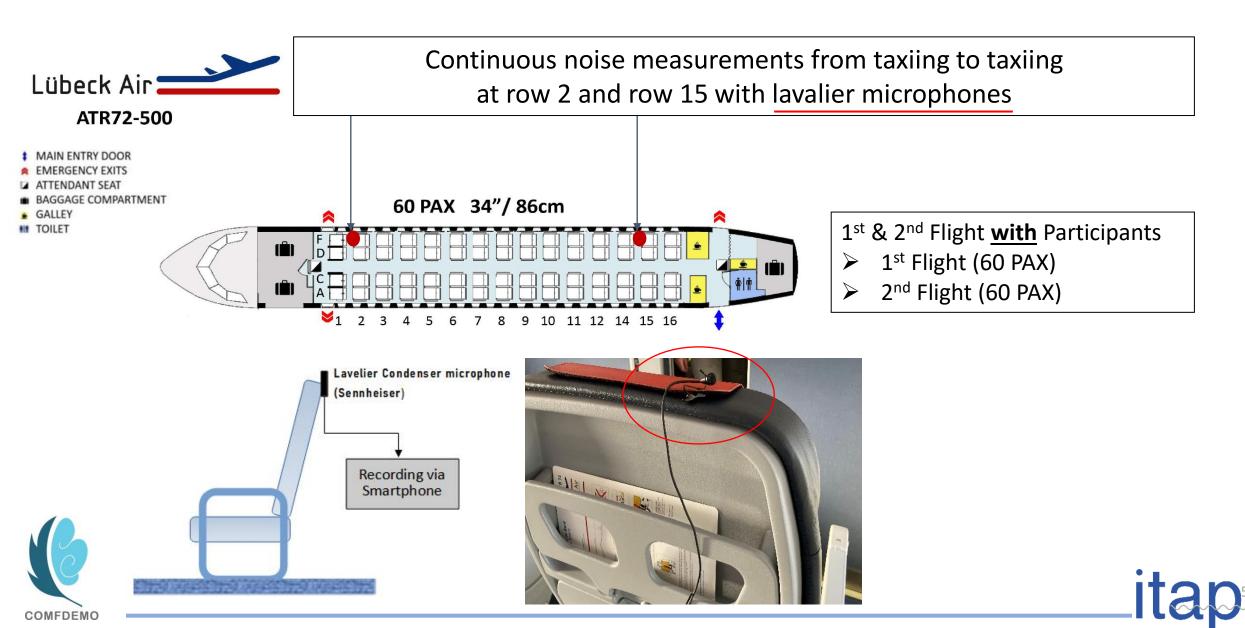
@row 15 | 3rd flight

vibration z-axis

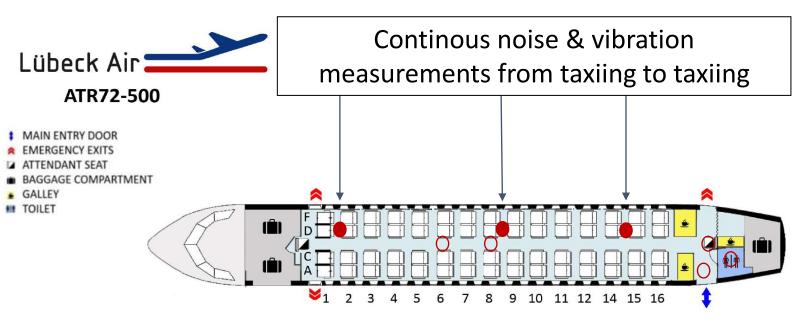




Flight situation and measurement positions 1st & 2nd Flight

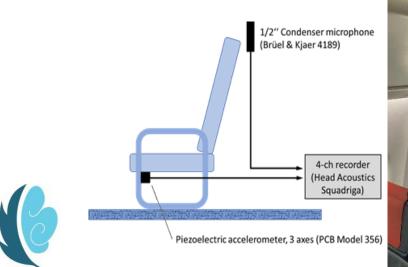


Flight situation and measurement positions 3rd Flight



3rd flight without PAX:

- noise and vibration measurements at row 2, 9 & 15
- Oadditional spot-measurements in aisle, galley and toilet





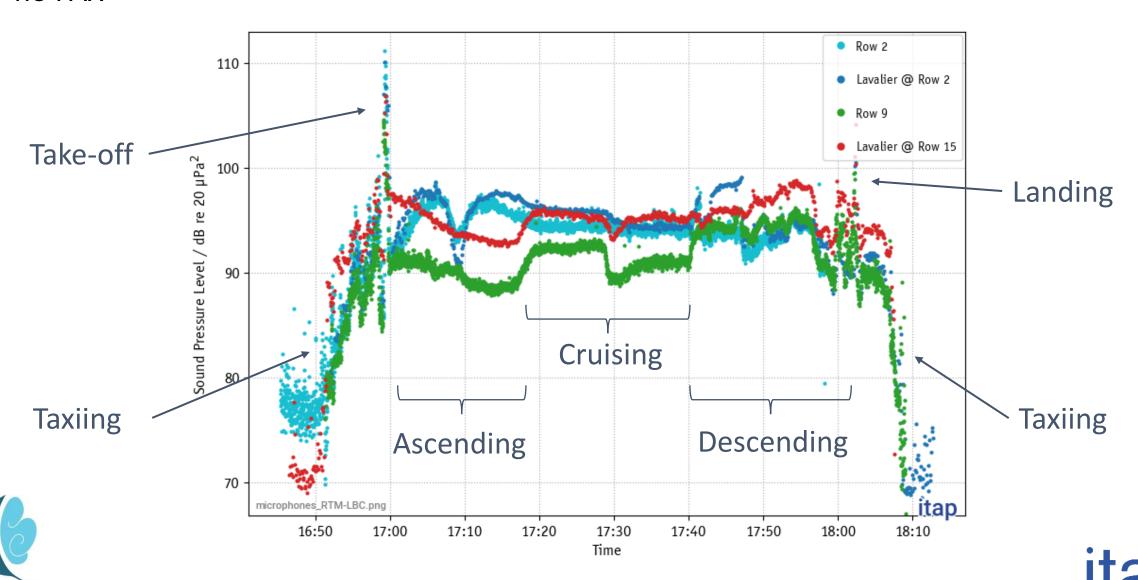


Due to safety restrictions extensive NVH measurements only during 3rd flight (without PAX)

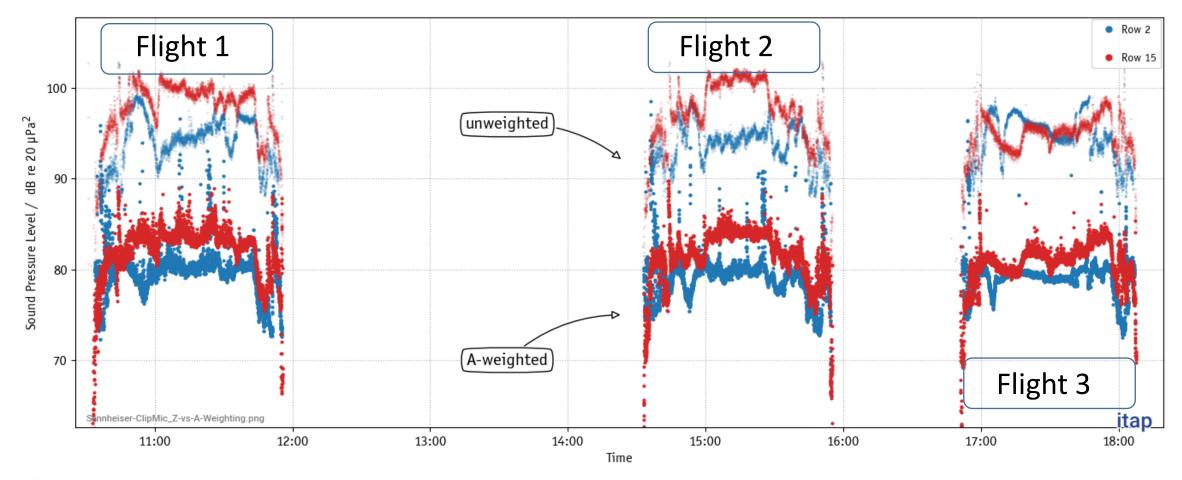




Measured Sound Pressure Level over time 3rd flight no PAX



Measured Sound Pressure Level over Time Comparison of flights







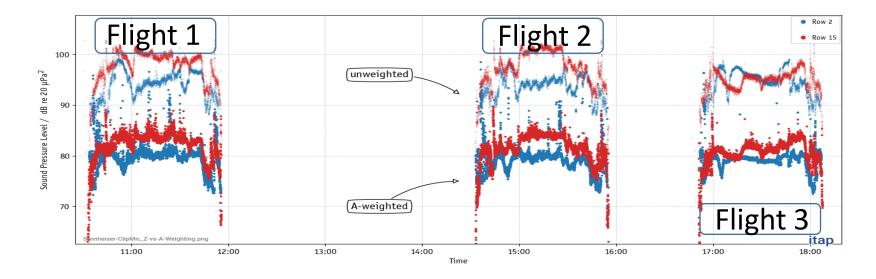
Measured Sound Pressure Level over Time

Unweighted SPL

- similar levels in both rows flight 1 and 2
 - both flights with PAX
- during cruising: higher levels @ row 15 of up to 10 dB compared to row 2
- > flight 3: similar SPL @ row 2 and row 15

A-weighting SPL

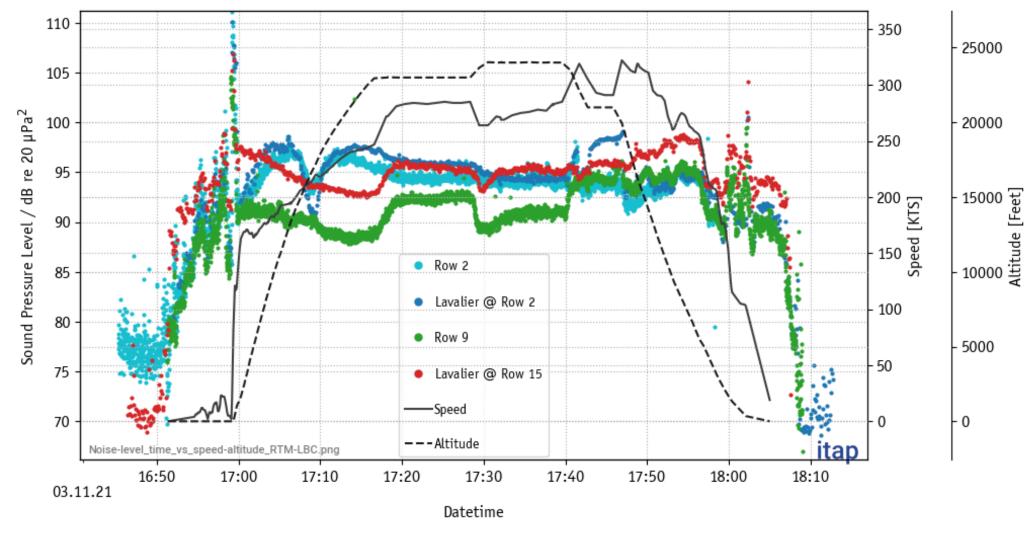
- slightly reduced level-differences between row2 and row 15 for all flights
- row 15 lower levels during flight 3
- Influencing factors: PAX, altitude, speed, other ?







Influencing factors on measured SPL 3rd flight

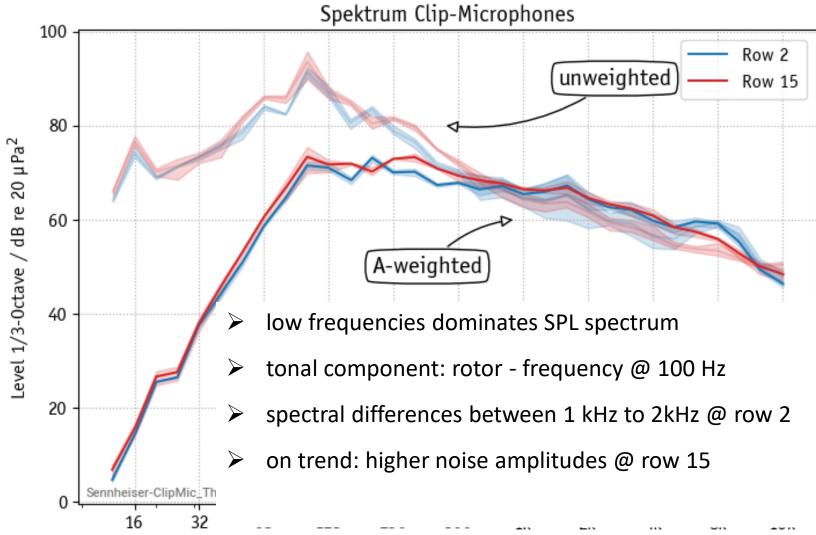




- > significant speed-dependency @ row 9 and row 15
- > Take- off starting with high velocity and SPL



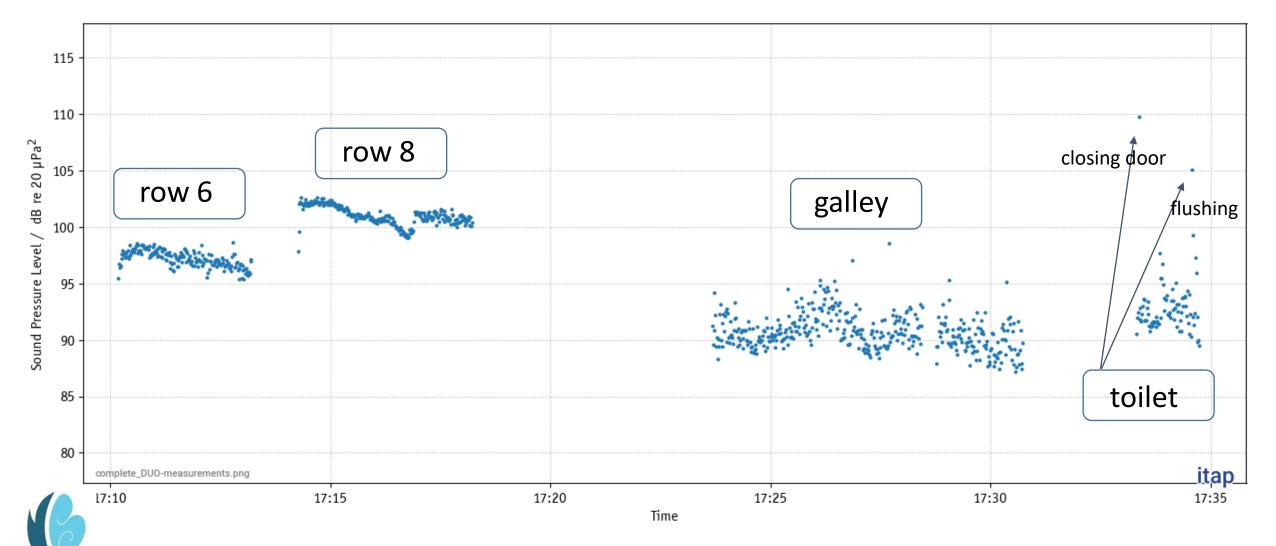
Noise spectra during cruising





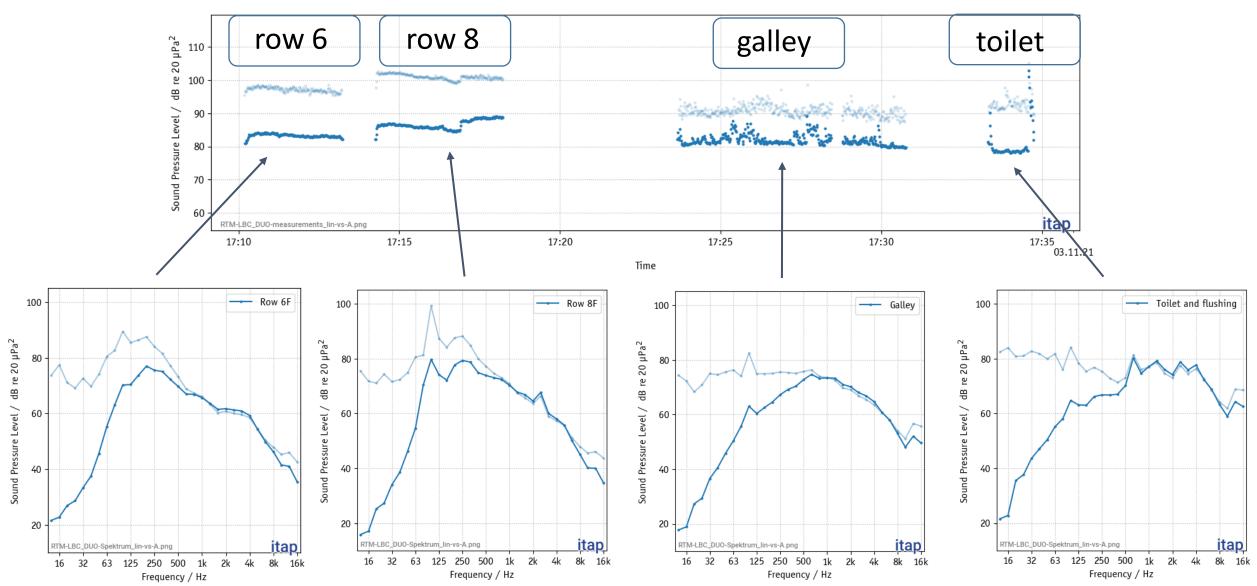


Measured Sound Pressure Level during cruising spot measurements as SPL vs time during 3rd flight

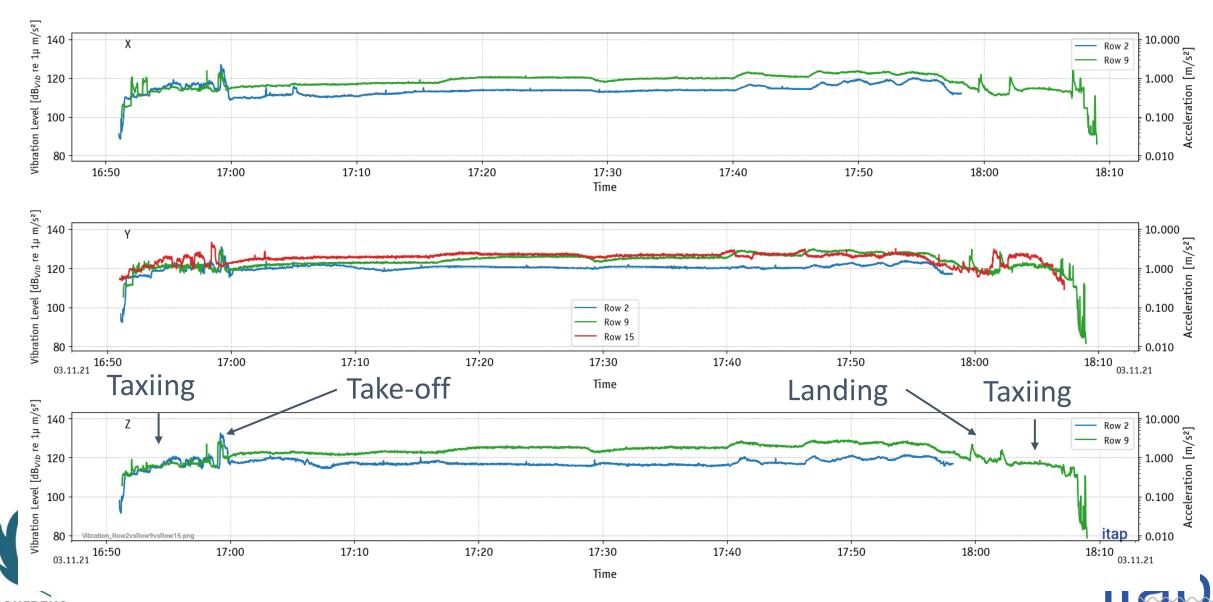




Measured Sound Pressure Level during cruising sprectra of spot measurements during 3rd flight



Measured Vibration level over Time 3rd flight no PAX



Take Home Message

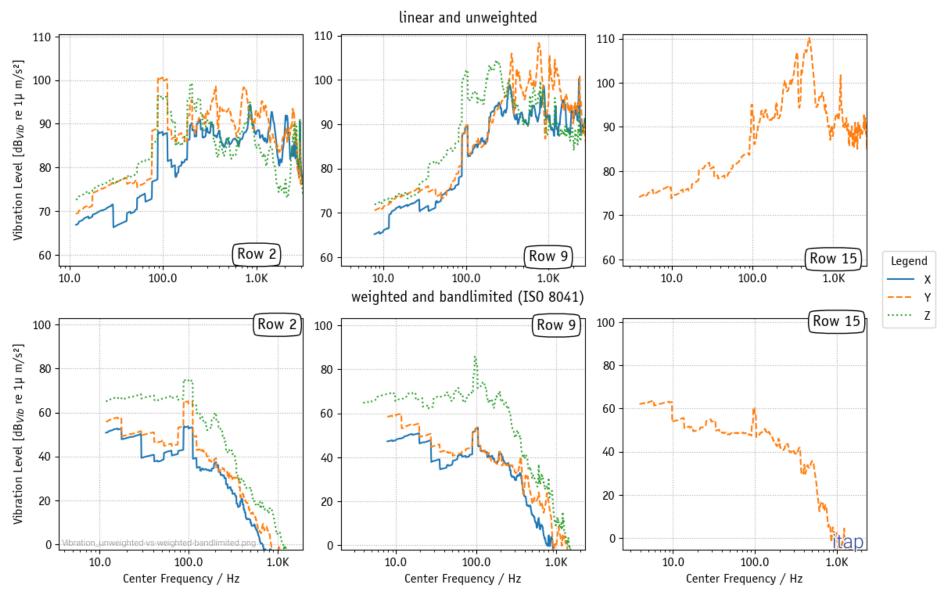
- Continuous Noise & Vibration measurements during 3 fligths with/without PAX in an ATR72-500
- Noise and Vibration significantly depending on flight phase (taxiing, take-off etc.) in level and spectrum which is highly correlated with altitude & flight speed
- Noise and Vibration significantly depending on location within the cabin (during cruising)
- > SPL is dominated by rotor frequency and by very low frequencies SPL(A) differ in 1 and 2 kHz frequency band
 - —for objective description of perceived noise psycho-acoustic metries are required
- Noise (& Vibration) might also depending on amount of PAX

Outlook:

- Recordings can be used for cabin demonstrator tests
- Further (psycho-acoustic) analysis are ongoing



Measured Vibration level over Time 3rd flight - cruising

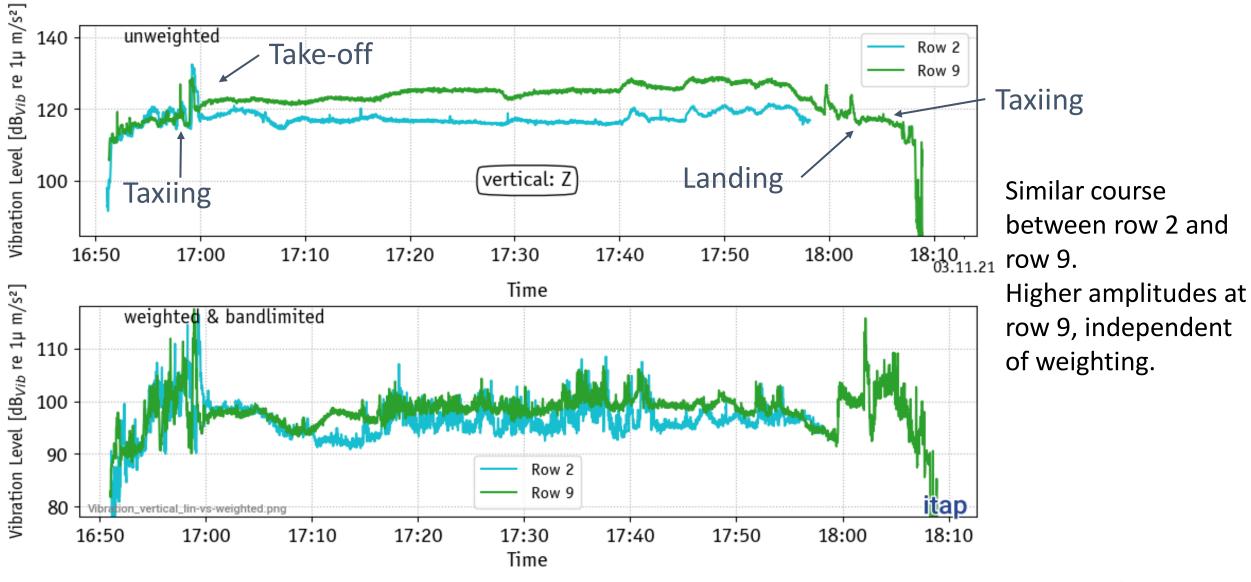


- blade frequency (~100 Hz) is dominating
- @ row 9 and 15
 higher frequencies
 dominating at Y axis

- only blade frequency (~100 Hz) is dominating
- assuming horizontal axes (X,Y) are not perceived



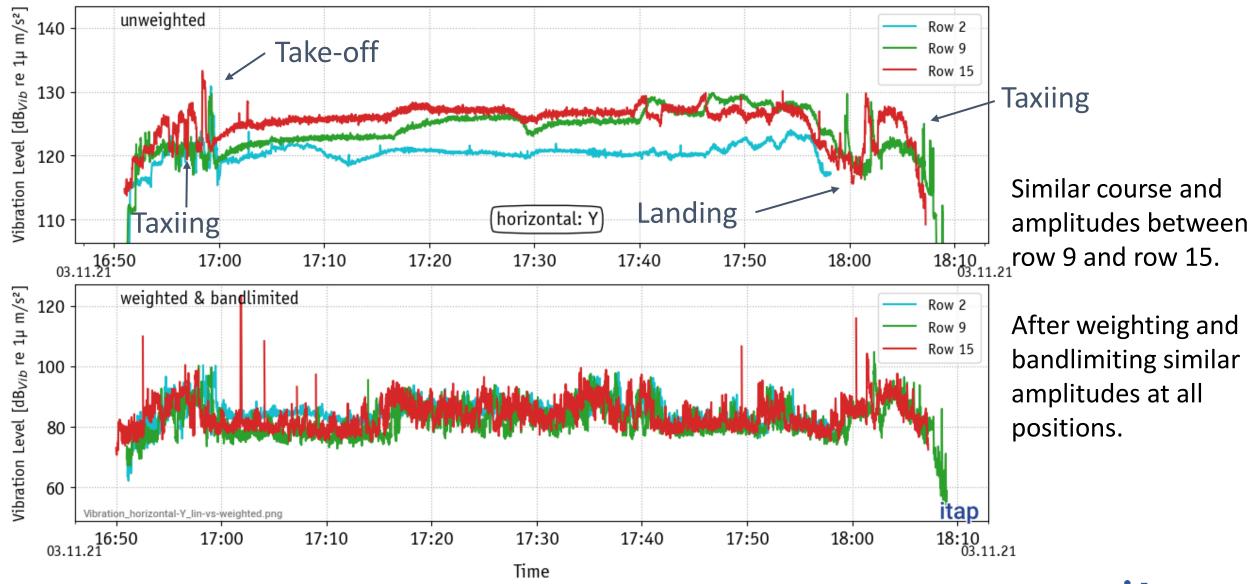
Measured Vibration level over Time 3rd flight







Measured Vibration level over Time 3rd flight





Laboratory evaluation of human response to aircraft environments

Prof. Dr. Neil Mansfield, Nottingham Trent University Dr. Geetika Aggarwal, Dr. Fred Vanheusden, Dr. Steve Faulkner











Aim – to understand how passengers integrate comfort / discomfort factors

- 1. Voice of the customer survey
- 2. Dual-modality trials
- 3. Tri-modal trials

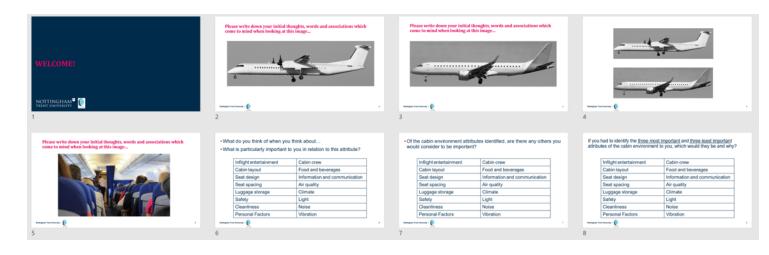


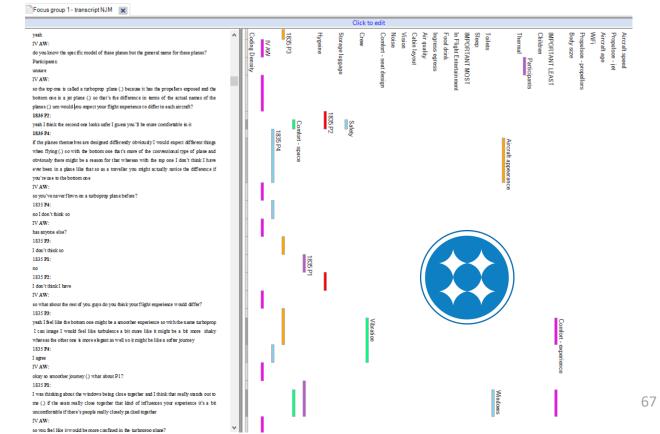
Voice of the customer study



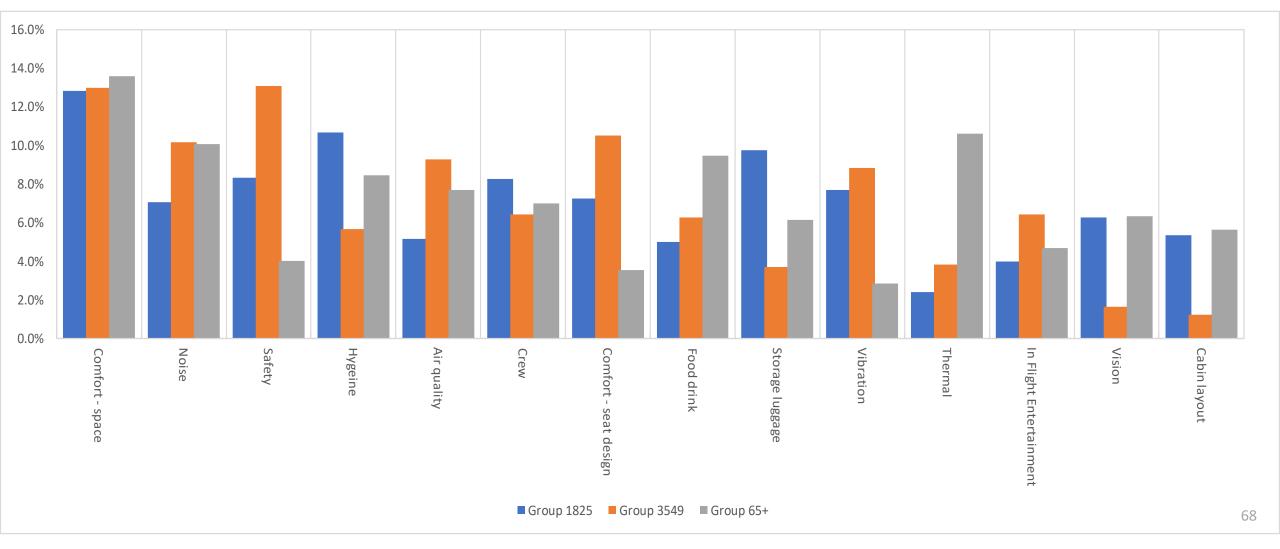
Voice of the customer study

- Focus group study to elicit opinions on aircraft and flight experiences
- Three focus groups:
 - Group 1, 18-25, n=4
 - Group 2, 35-49, n=5
 - Group 3, 50-70, n=5
- Transcribed and analysed in nVivo

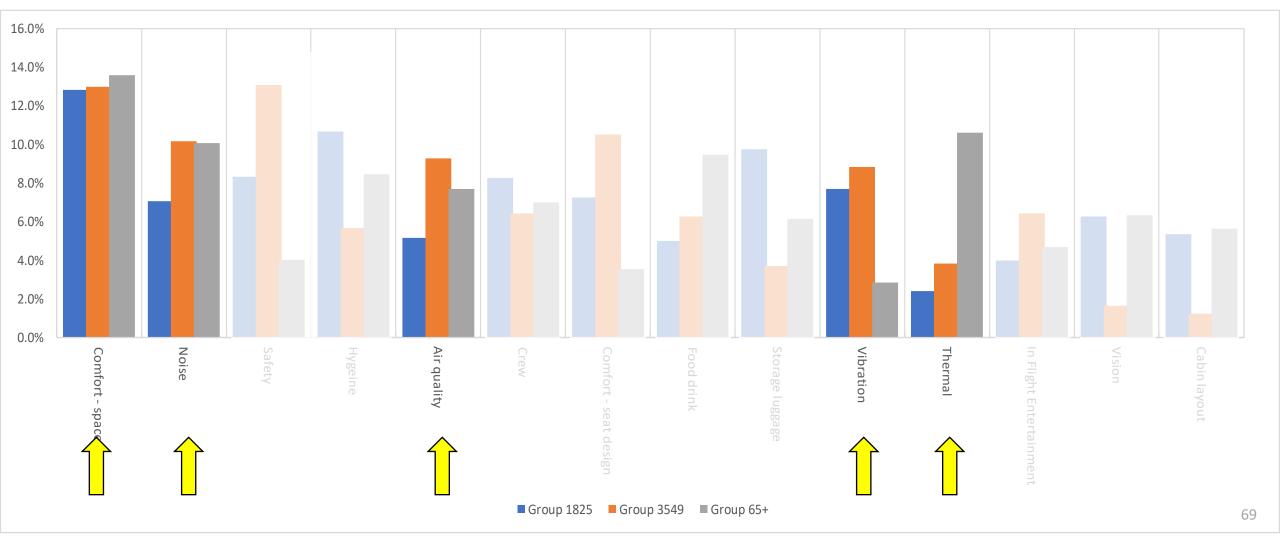




Voice of the customer: Normalised coding count (top 10 for each)



Voice of the customer: Normalised coding count (top 10 for each)



Combined stressors

Additive:

Impact of 'A' and 'B' combined (%) = Impact of 'A' (%) + Impact of 'B' (%)

Synergistic (cross-modal):

Impact of 'A' and 'B' combined (%) > Impact of 'A' (%) + Impact of 'B' (%)

Antagonistic (masking):

Impact of 'A' and 'B' combined (%) < Impact of 'A' (%) + Impact of 'B' (%)

Dual modality trials

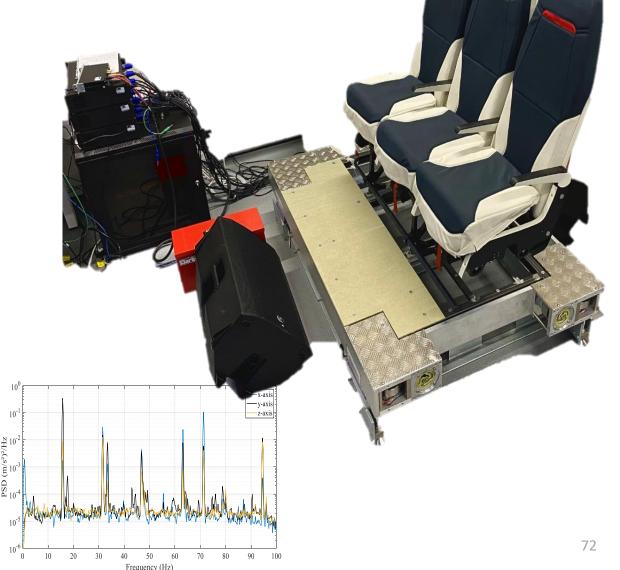


Dual modality trials – noise and vibration

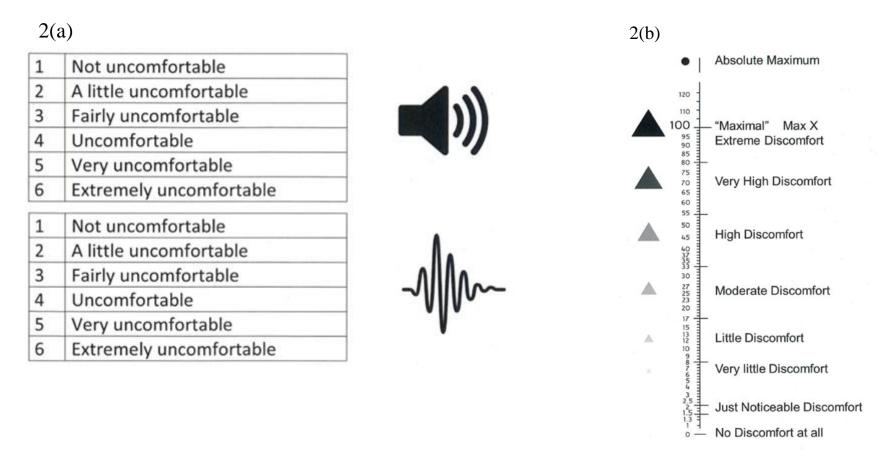
- 18 volunteers, 1 person at a time
- 4 x turboprop vibration
- 4 x turboprop noise
- Each sample, 15 seconds

Turboprop cabin vibration (m/s² r.m.s.)	Turboprop cabin noise (dB(A))
0.50	72
0.67	78
0.83	84
1.00	90

Bandlimited, 0.8-100 Hz *unweighted*



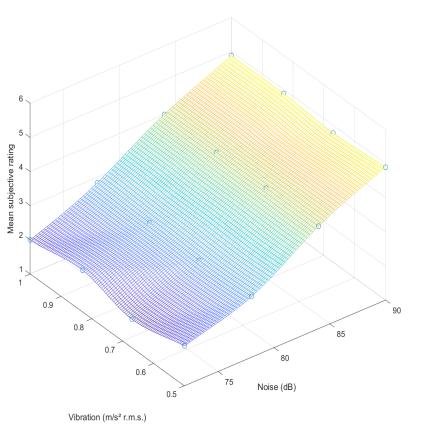
Subjective data collection — ISO2631-1 / CR100





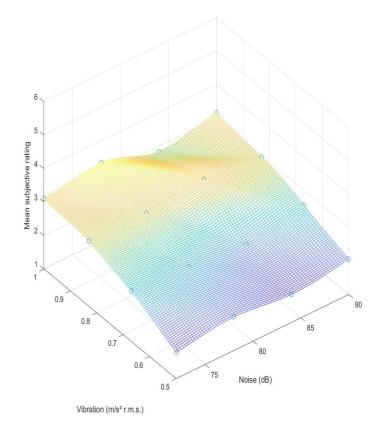
Subjective response scales. (a) Noise ratings and Vibration ratings based on scale from ISO 2631-1. (Sammonds et al., 2017 and Mansfield, N.J. 2004) (b) Borg CR100 scale for overall discomfort ratings. Adapted from (Borg. E, 2002).

Noise Discomfort



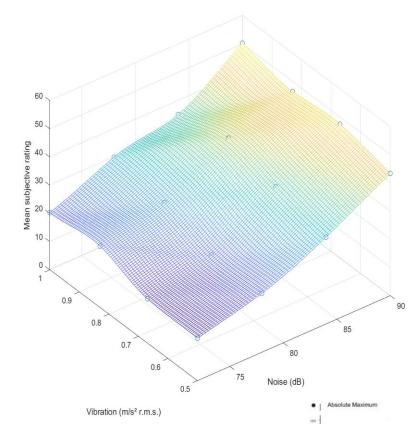
1	Not uncomfortable	
2	A little uncomfortable	
3	Fairly uncomfortable	
4	Uncomfortable	
5	Very uncomfortable	
6	Extremely uncomfortable	

<u>Vibration</u> Discomfort



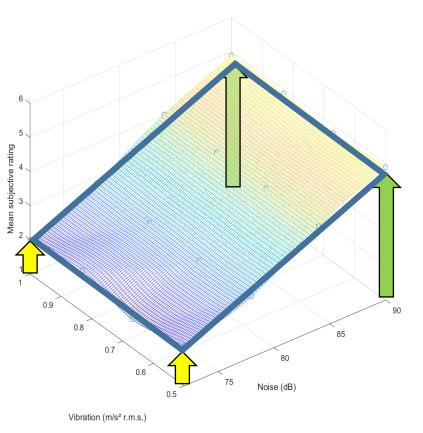
1	Not uncomfortable
2	A little uncomfortable
3	Fairly uncomfortable
4	Uncomfortable
5	Very uncomfortable
6	Extremely uncomfortable

Overall Discomfort



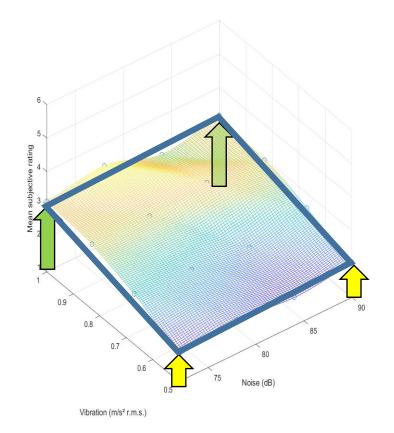
Little Discomfort 7/

Noise Discomfort



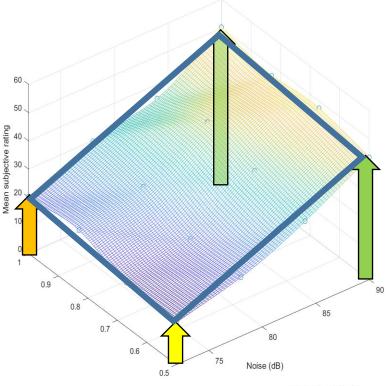
1	Not uncomfortable
2	A little uncomfortable
3	Fairly uncomfortable
4	Uncomfortable
5	Very uncomfortable
6	Extremely uncomfortable

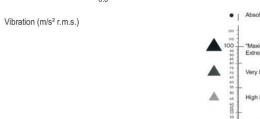
<u>Vibration</u> Discomfort



1	Not uncomfortable
2	A little uncomfortable
3	Fairly uncomfortable
4	Uncomfortable
5	Very uncomfortable
6	Extremely uncomfortable

Overall Discomfort

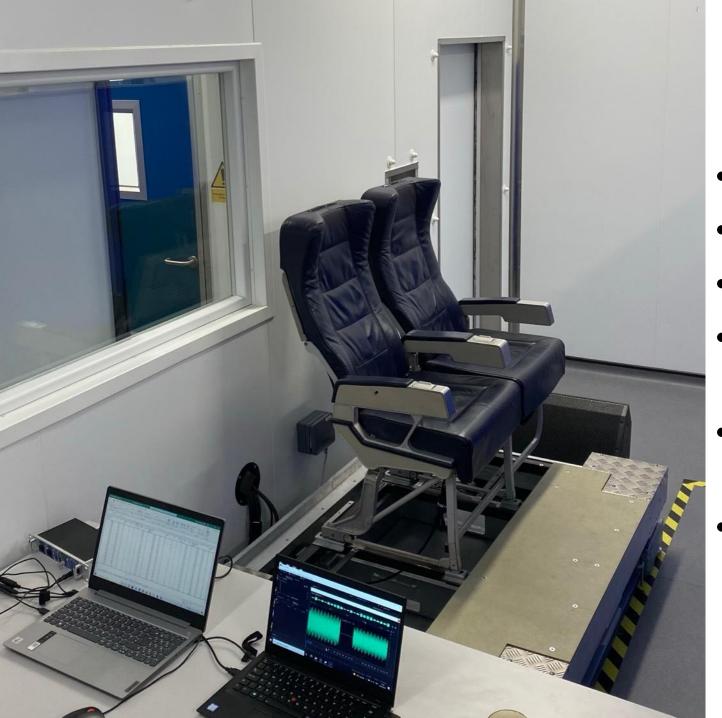




Little Discomfort 7

Tri-modal trials





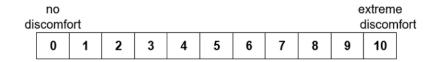
Tri-modal trials

- Environmental chamber
- Airline seat (BAe 146)
- 20 volunteers, 1 person at a time
- Vibration:
 - 0.75, 1.5, 2.25, 3.0 m/s² bandlimited
- Noise:
 - 78, 82, 86, 90 dB(A)
- Ramped temperature:
 - 20, 24, 28, 32 deg C

Tri-modal trials

(a) Please rate your discomfort from the NOISE:





(b) Please rate your discomfort from the VIBRATION:

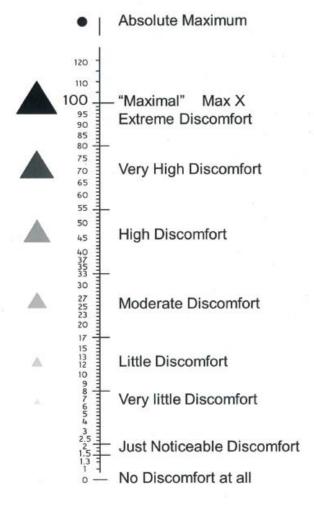


	no									е	extrem	е
dis	scomf	ort								(discom	nfort
	0	1	2	3	4	5	6	7	8	9	10	

(c) Using the following scale please rate how you feel now:



Hot	3
Warm	2
Slightly Warm	1
Neutral	0
Slightly Cool	-1
Cool	-2
Cold	-3



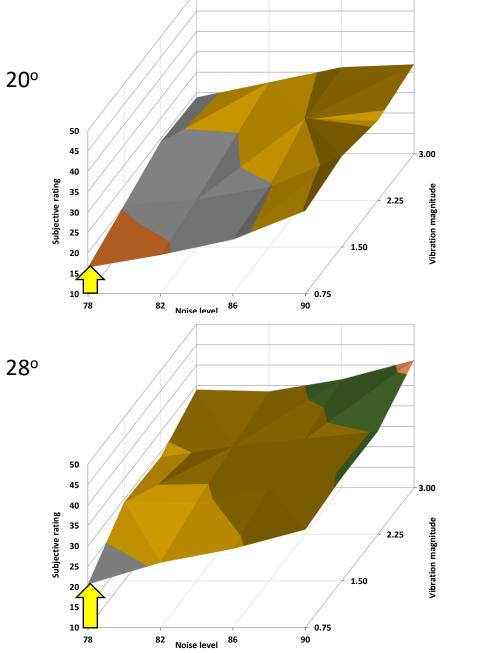


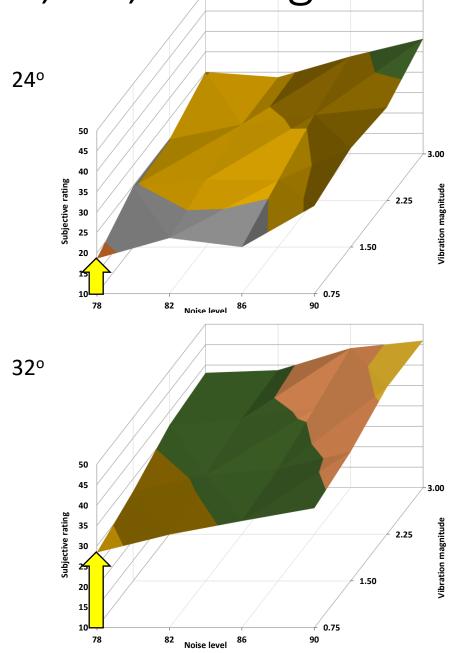
"In order to improve your comfort would you prefer to reduce the noise, vibration, increase temperature or decrease temperature?"

Forced choice question

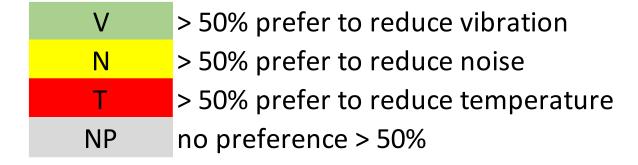


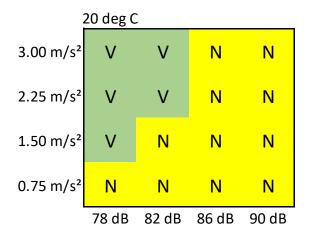
Overall discomfort – 20, 24, 28, 32 degrees

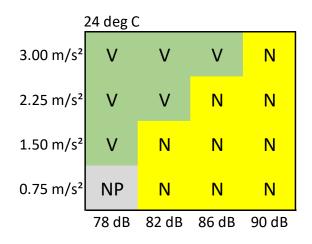


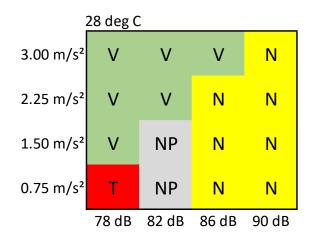


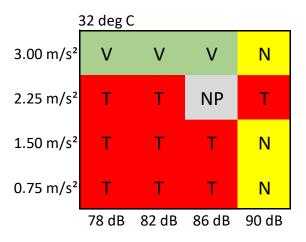
Preference













Conclusion/Key Takeaways

- This research study investigated the relative contribution of noise, vibration and thermal/temperature stimuli to human discomfort in an aircraft cabin.
- The vibration discomfort ratings of the participants increased with increase in vibration magnitudes, but not with noise or temperature.
- The noise discomfort ratings of the participants increased with increase in noise, but not with vibration or temperature.
- The overall discomfort score of the participants increased with increase in noise levels, vibration magnitudes and temperature.
- Preference for modality to improve environment varies with noise, vibration and temperature.



Impact of noise cancelling headphones on passenger comfort in Turboprop airplanes

Gerbera Vledder, TU Delft





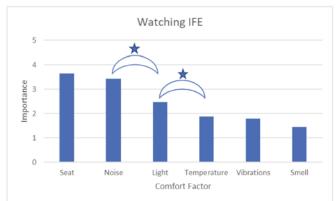




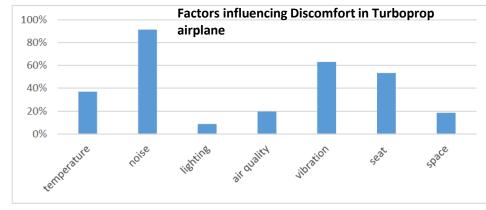


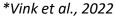
Background

- In turboprop aircraft the sound volume is much louder compared to a jet.
- Influence of noise on passenger comfort and discomfort (Bouwens, 2018)(Vink et al., 2022)
- Being in control of noise levels improves the aircraft seat comfort (Bouwens et al., 2021).



*Bouwens, 2018







Research objectives

- Influence of active noise cancelling headphones (ANC) on comfort of passengers in turboprop airplanes during in flight entertainment.
- Comparison of ANC headphones with earplugs.
- Comfort difference between turboprop airplane and jet engine airplane sound.



Vs.

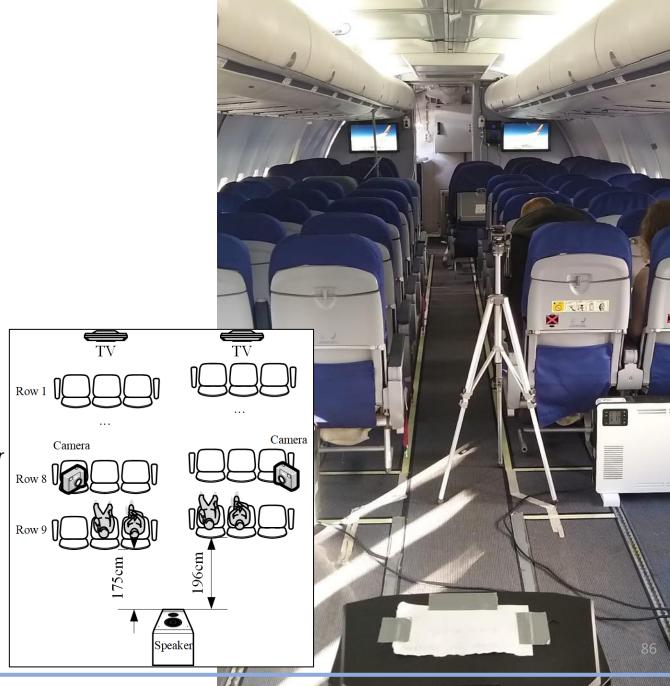




Research setup

- 24 participants (age 18-39)(50/50% Male/Female)
- Passenger activity: Smartphone, book or ereader device (without sound)
- 4 conditions x 45 min.
 - 1. Jet engine sound
 - 2. Turboprop sound
 - 3. Turboprop sound + ANC headphones
 - 4. Turboprop sound + earplugs

^{*} The recorded sound and volume of Comfdemo is used as basis for this test.



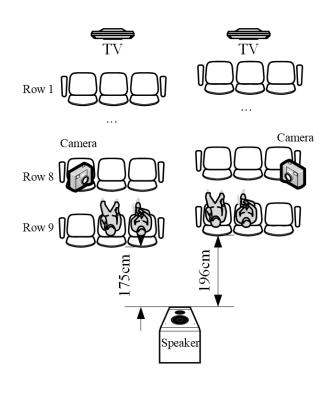


Noise distribution in the simulation setup

dB distribution across seats (average)

	9B	9C	9D	9E
B737	84,6	86,1	86,0	84,2
ATR	86,3	84,9	84,8	86,3

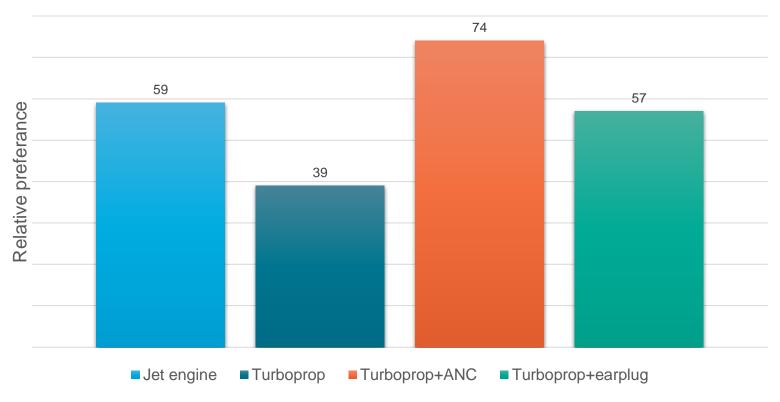
• Jet sound vs. Turboprop sound: difference in sound reflection in the interior.





Overall preference

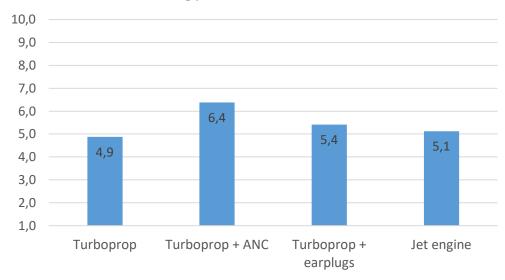
Condition preferance



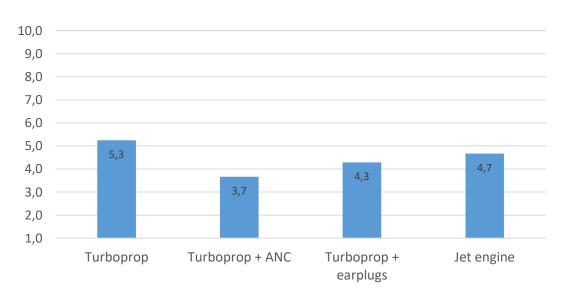


Comfort and Discomfort comparison

Comfort rating per condition after 45min.



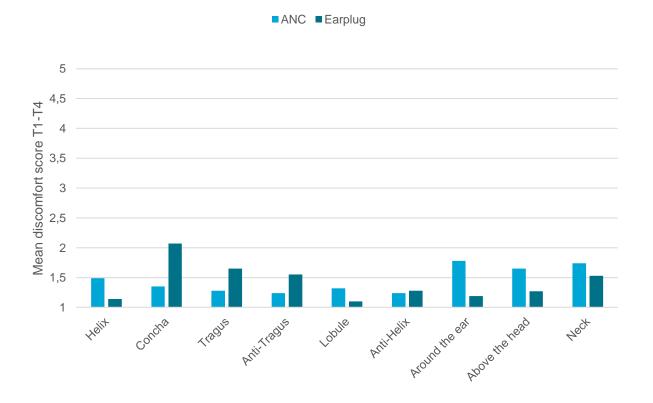
Discomfort rating per condition after 45min.

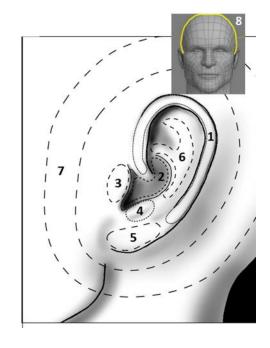




ANC vs. Earlugs

Local Body Part Discomfort: around the ear





1	Helix
2	Concha
3	Tragus
4	Anti- tragus
5	Lobule
6	Anti- helix
7	Around the ear
8	Above the head
9	Neck
,	IVCCK



ANC vs. Earplugs

Active Noise Cancelling headphones

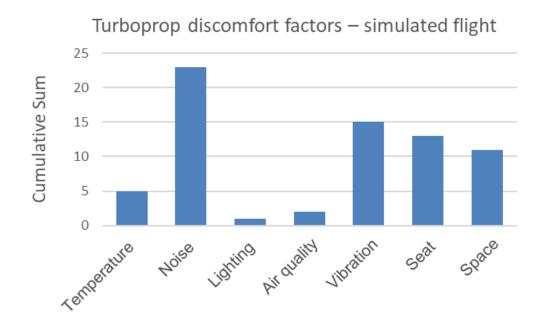
- Heightened awareness of vibrations and heartbeat
- Feeling of air pressure change
- Gives option to play music
- Create a feeling of privacy

Earplugs

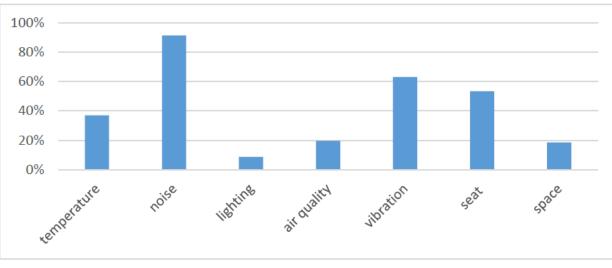
- Blocks out less noise
- Less heavy on the head
- Easy to implement measure



Discomfort factors compared



Turboprop discomfort factors – real flight



*Vink et al., 2022



Key takeaways:

- Active Noise Cancelling Headphones are preferred over Earplugs.
- Jet sound is preferred over Turboprop sound.
- Valid research setup for acoustic comfort related studies.
- Sound reflection for jet sound is different then for turboprop sound.



Towards a comfort model of passenger comfort experience in turboprop aircraft

Prof. Dr. Neil Mansfield, Nottingham Trent University

Prof. Dr. Britta Herbig, Ludwig-Maximilians-Universität München





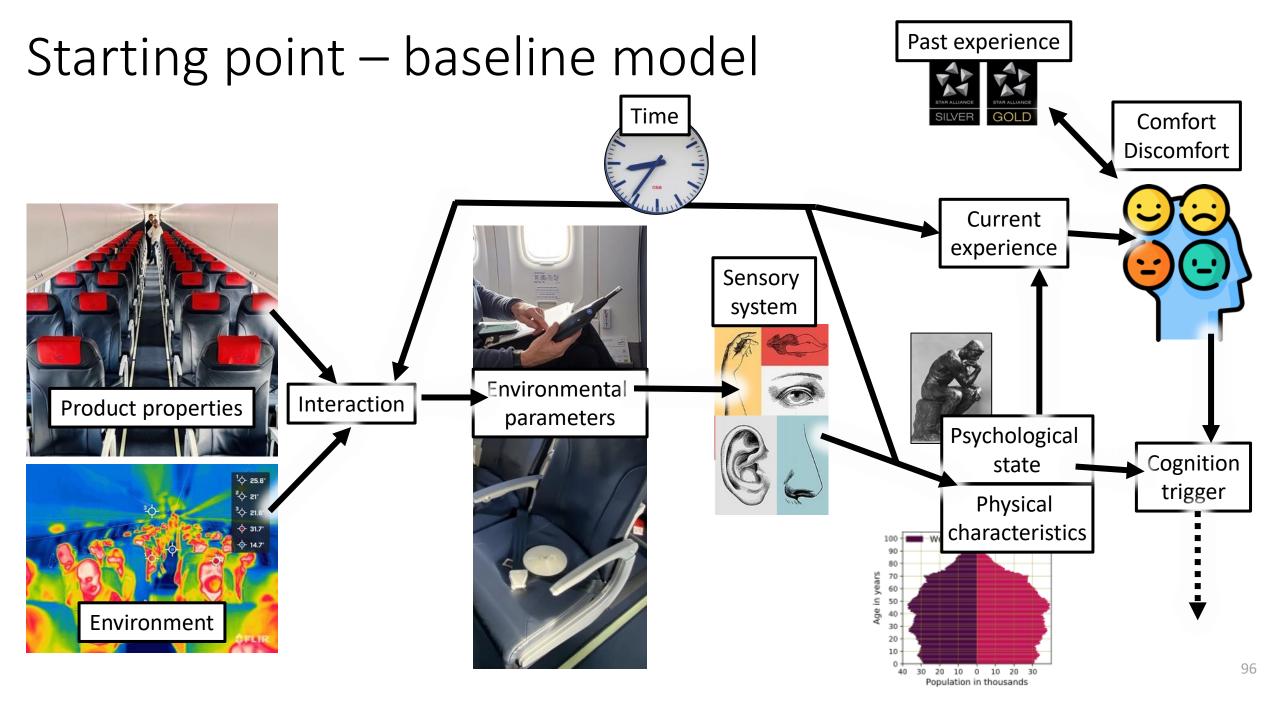




Aim – to build a model(s) of passenger experience of turboprop aircraft

- 1. Concept model baseline factors
- 2. Comfort model from flight and lab tests
- 3. Numerical models from lab test





Starting point – baseline model

Past experience

Time

Comfort Discomfort

Sensory system

Current experience

Product properties

Interaction

Environmental parameters

Psychological state

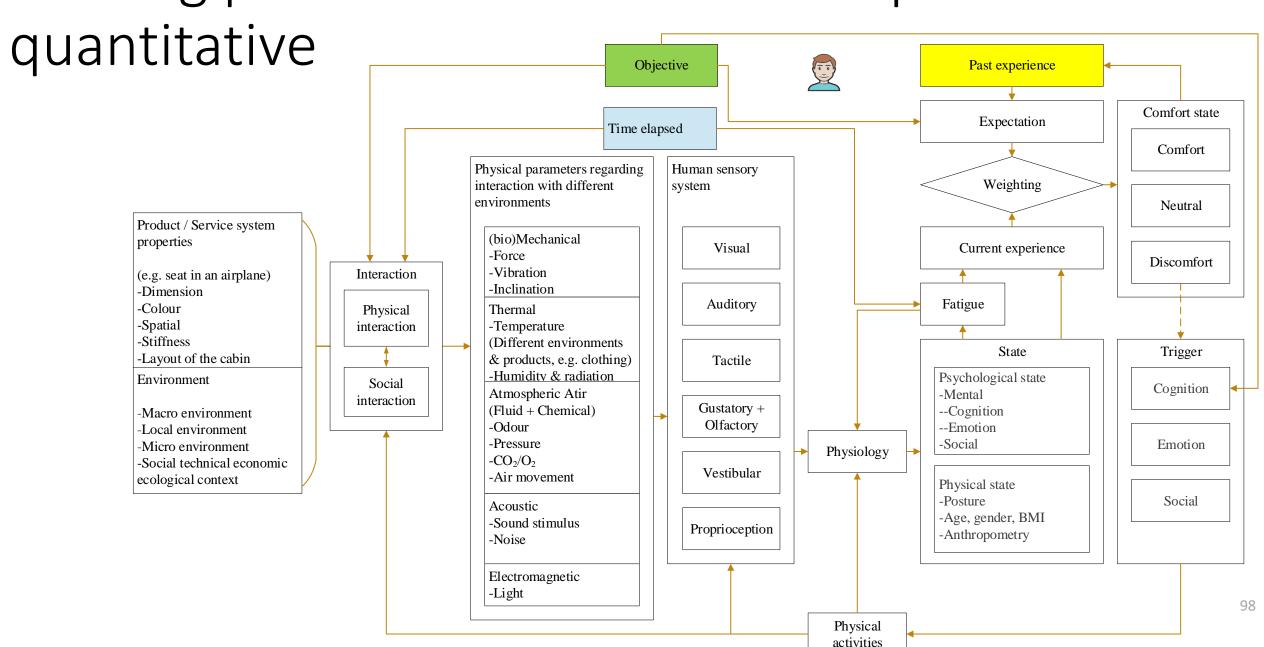
Physical characteristics

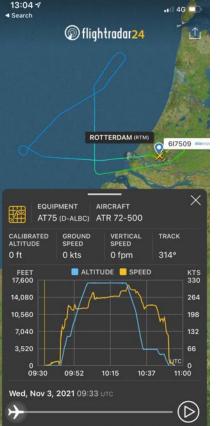
Cognition trigger



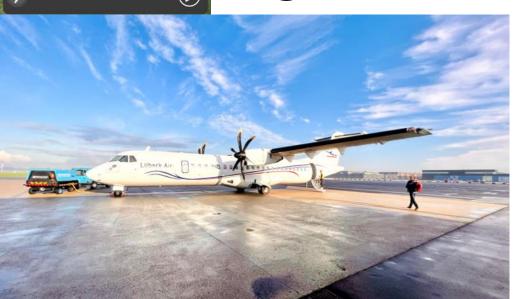
Environment

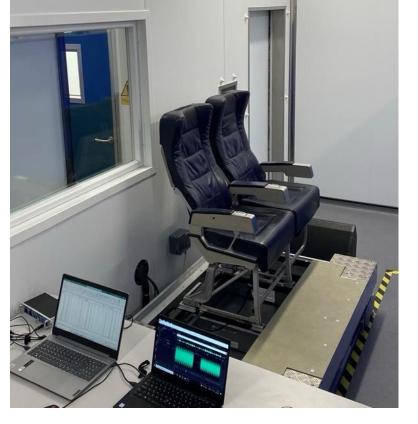
Starting point – baseline model – qualitative and





Flight test





Lab tests

Cabin simulators



Dimension measured during flight tests

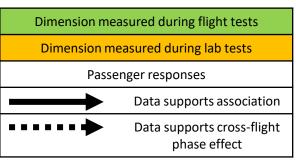
Dimension measured during lab tests

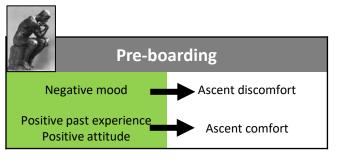
Passenger responses

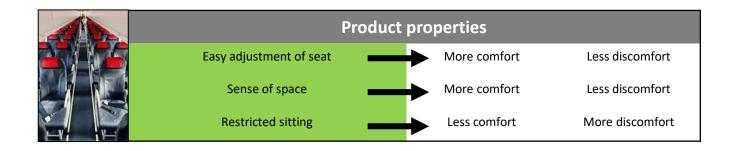
Data supports association

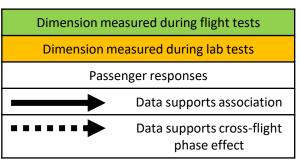
Data supports cross-flight phase effect



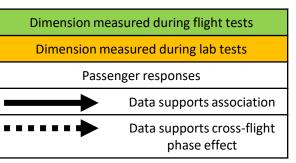


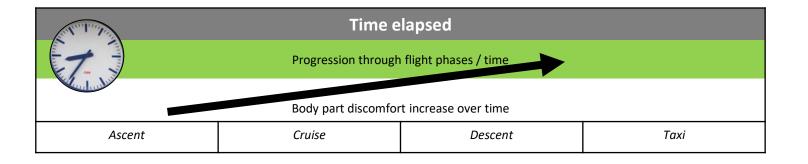


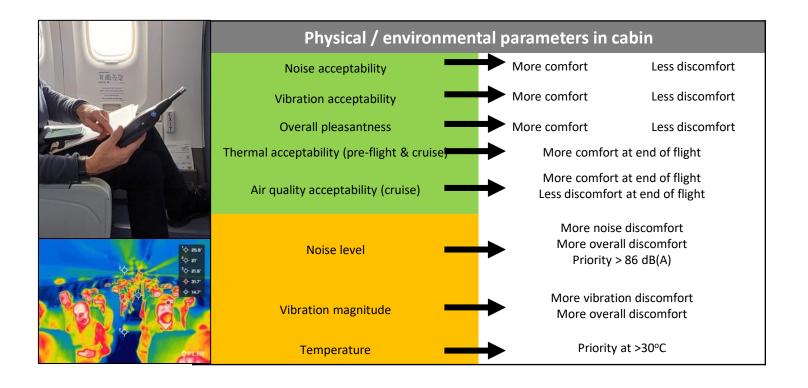


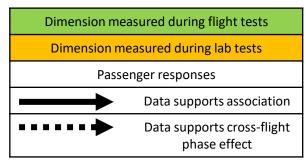


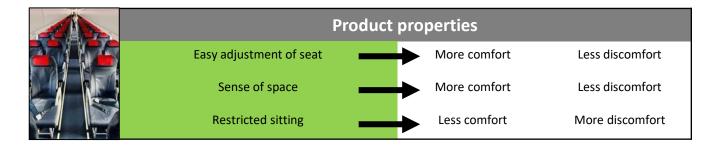


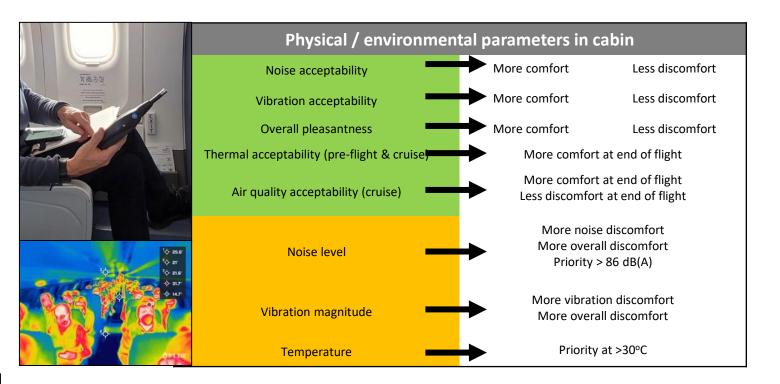












Dimension measured during flight tests

Dimension measured during lab tests

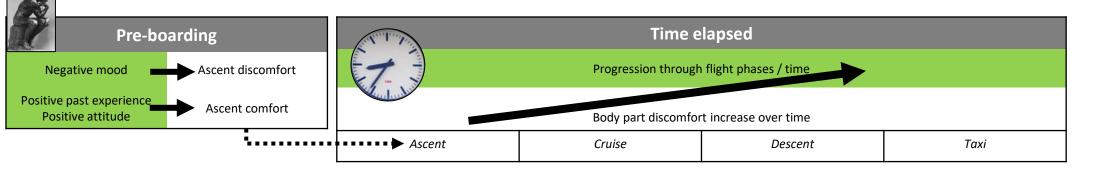
Passenger responses

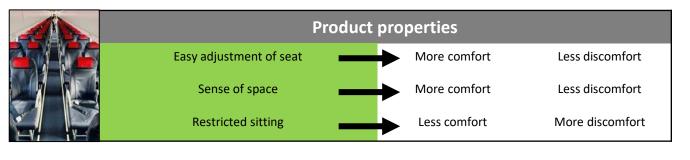
Data supports association

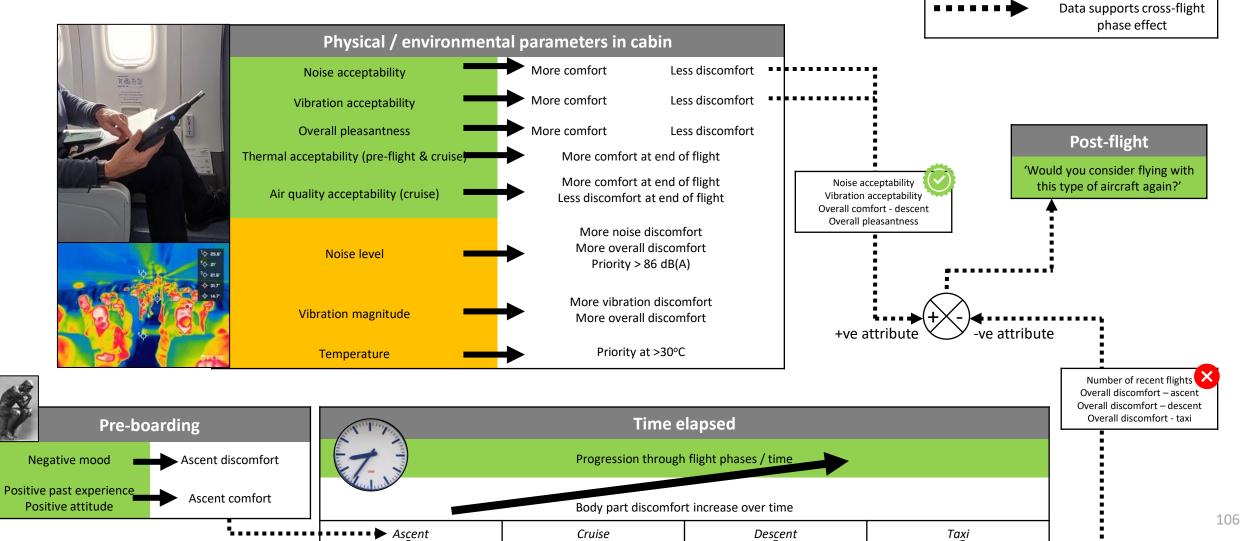
Data supports cross-flight phase effect

Post-flight

'Would you consider flying with this type of aircraft again?'







Dimension measured during flight tests

Dimension measured during lab tests

Passenger responses

Data supports association

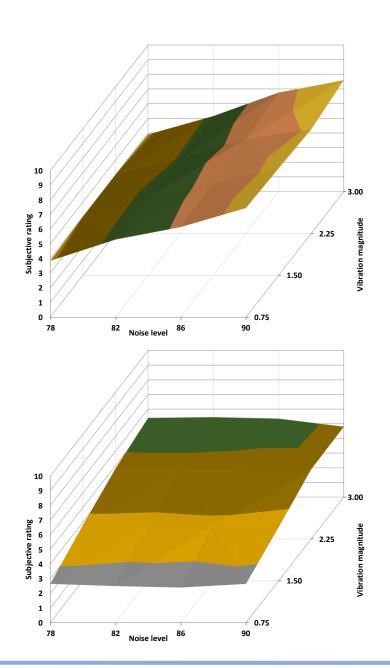
Noise / vibration / thermal comfort models

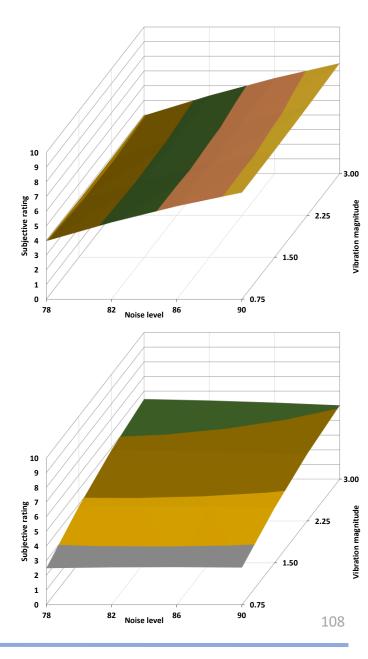


Polynomial surface

- Top Noise
- Bottom Vibration

- Left measured
- Right modelled







Noise / vibration models

 Noise and vibration models were created using a polynomial function for x (noise) and y (vibration); one for each temperature. Curve fitted in MATLAB.

$$f(x,y) = p00 + p10x + p01y + p20x^2 + p11xy + p02y^2$$

Table 2. Descriptors for polynomial coefficients						
Coefficient	Description					
p00	Constant value					
p10	Linear coefficient (noise)					
p20	Second order coefficient (noise)					
p01	Linear coefficient (vibration)					
p02	Second order coefficient (vibration)					
p11	Coefficient of interaction between noise and vibration					

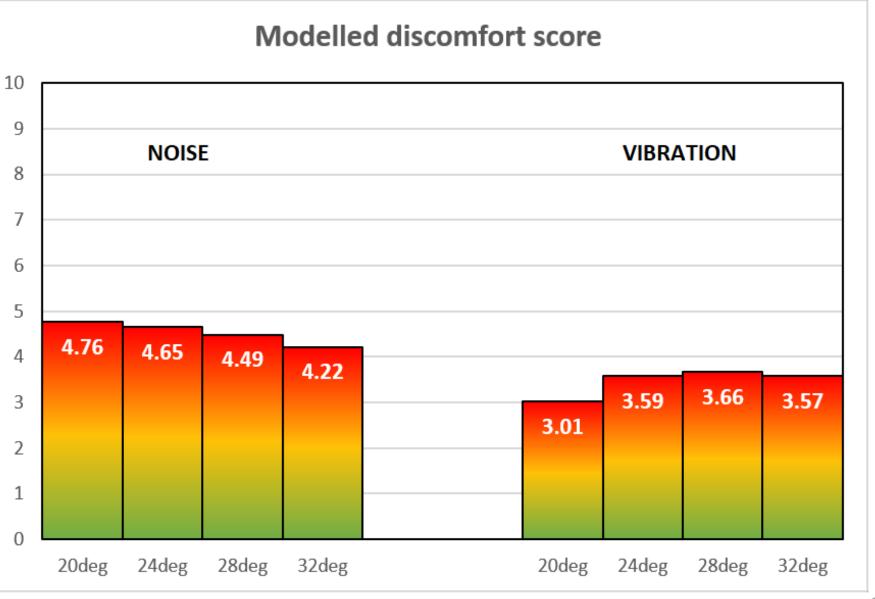


Noise 78-90

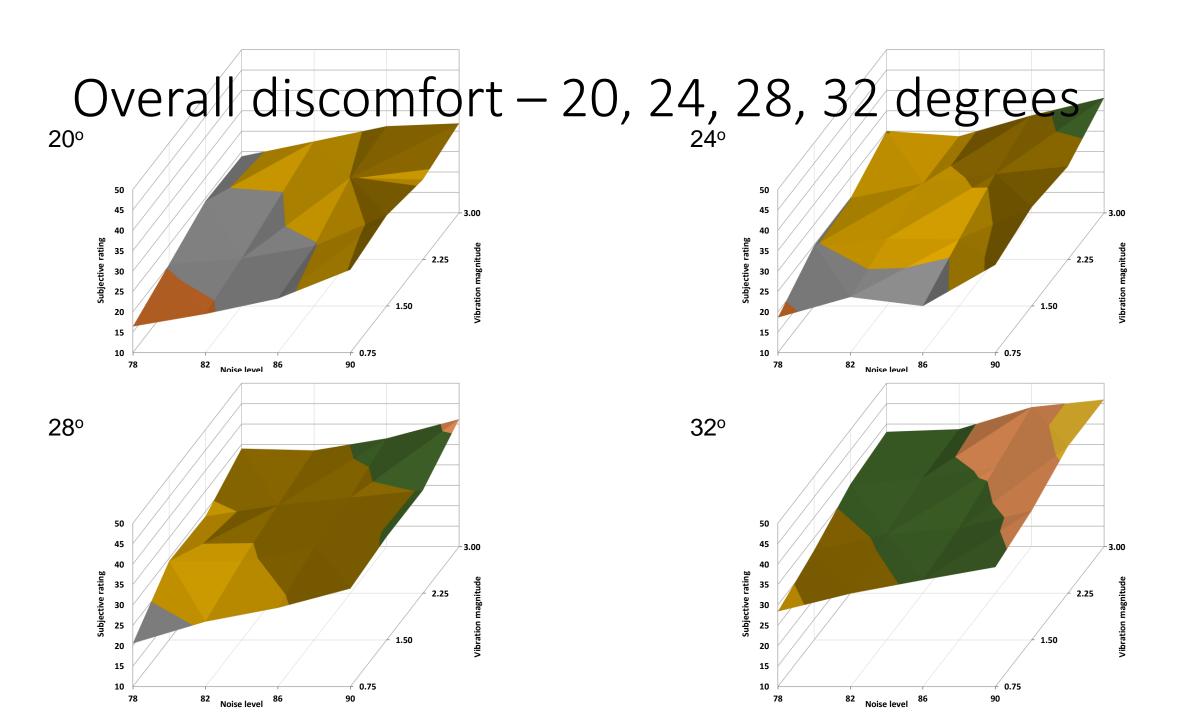
80.5

Vibration 0.75-3.00

1.00



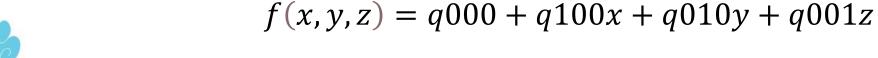




Overall model – machine learning

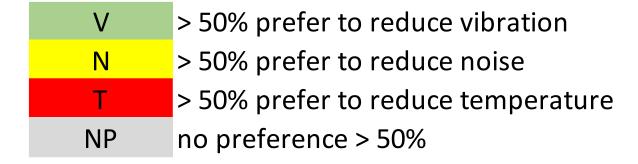
- K-fold cross-validation method
- Inclusion of noise (x), vibration (y), temperature (z) as linear coefficients

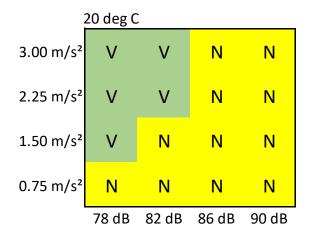
- Data randomly assigned to one of 5 data sets, each comprising 256 test conditions
- 5 repeats of multiple linear regression in SPSS using 4 of 5 data sets as training set and one data set as test data

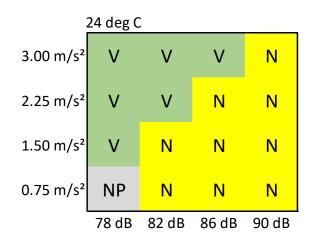


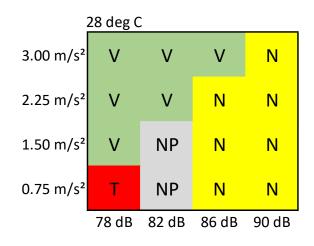


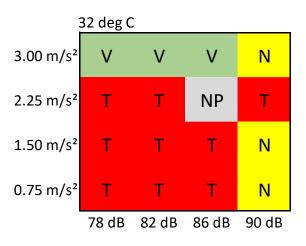
Preference













Machine learning overall / preference model

Vibration magnitude (0.75-3.00) Noise level (78-90) Temperature (20-32)	2.00 78 20		100.0	Moderate discomfort Reduce vibration		
PREDICTED OVERALL DISCOMFORT SCORE	21.2		-	_		_
PREDICTED DESCRIPTOR PREDICTED CHANGE	Moderate discomfort Reduce vibration	69%	-		21.2	
SUM OF CHANGE PERCENTAGES	Treduce Vibration	108%	10.0			
			-			
			-			
			1.0	PREDICTED	OVERALL DISCOMF	ORT SCORE

Interaction and Questions

Interaction between attendees and speakers on webinar so far + discussion









Acknowledgements







This project has received funding from the Clean Sky 2 Joint Undertaking (JU) under grant agreement No 831992. The JU receives support from the European Union's Horizon 2020 research and innovation programme and the Clean Sky 2 JU members other than the Union.