

# Optical properties of Martian dust – II. Modeling

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RoadMap: Dust on Mars Workshop 19.-21.9.2023







### About me

- 2021: PhD in astrophysics at the University of Helsinki
  - Specialization in light scattering: modeling, experiments, and observational astronomy
  - 2019-2021: Support astronomer at the Nordic Optical Telescope, La Palma, Spain
- 2021  $\rightarrow$ : Instituto de Astrofísica de Andalucia, Granada, Spain
  - Scientist in the RoadMap-project
  - Optical properties retrieval for Martian dust



Lunar eclipse, May 16<sup>th</sup> 2022, La Palma, Spain





RoadMop Outline

### **PART I: Theory**

- Introduction to RoadMap
- Background: Scattering theory

### **PART II: Modeling**

- Modeling
- Samples
- Optical constants retrieval
- Scattering properties
- Summary







# **PART I: Theory**



This project has received funding from the European Union's Horizon 2020 research and innovation programme under grant agreement No 101004052





- RoadMap: ROle and impAct of Dust and clouds in the Martian AtmosPhere
  - Laboratory measurements and models to better describe Martian dust and clouds
  - Aim: database of scattering properties for Martian dust
- Optical constants, the complex refractive indices (*m*=*n*+i*k*), are needed in light scattering and radiative transfer models
  - The real part, *n*, describes the ratio of the speed of light in a vacuum to the phase velocity of light in the material
  - The imaginary part, k, describes the absorption of light inside the material









- Limitations on optical constant retrievals based on observations
  - multiple free parameters
  - simplified particle shapes: spheres, spheroids, cylinders
  - no direct particle size distribution measurements
- Experimental data needed to characterize the samples well
  - constraints on particle sizes and shapes  $\rightarrow$  the only free parameter is the complex refractive index
  - combined with a model based on advanced numerical techniques









## Background: Scattering theory

- **Photometry**: measures the intensity of the object's electromagnetic radiation
- **Polarimetry**: study of the polarization of light
- **Spectroscopy**: how much electromagnetic radiation is scattered, absorbed, or emitted by the object at different wavelengths



cyberphysics.com.uk





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# Background: Scattering theory

Spectroscopy

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# Background: Scattering theory Scattering event: $\begin{pmatrix} I_0 \\ U_0 \\ U_0 \\ V_0 \end{pmatrix}$ Incident light Scattering plane

#### Light characterized by the Stokes parameters

$$\begin{pmatrix} I \\ Q \\ U \\ V \end{pmatrix} = \frac{\lambda^2}{4\pi^2 R^2} \begin{pmatrix} F_{11} & F_{12} & F_{13} & F_{14} \\ F_{21} & F_{22} & F_{23} & F_{24} \\ F_{31} & F_{32} & F_{33} & F_{34} \\ F_{41} & F_{42} & F_{43} & F_{44} \end{pmatrix} \begin{pmatrix} I_0 \\ Q_0 \\ U_0 \\ V_0 \end{pmatrix}$$

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# Background: Scattering theory





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• A scattering event can change the state of the incident light – The change is fully described by a 4x4 Mueller matrix, the so called scattering matrix F

- F is a function of the scattering angle  $\theta$  or the phase angle  $\alpha = \pi - \theta$ 

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• After a light beam interacts with an object, part of it can either scatter or be absorbed

 Multiple factors affect the amount of scattering and absorption: size and shape of the object, optical properties (such as the complex refractive index), porosity, particle orientation, and the wavelength of the incident light







Depolarization ratio

$$\delta_{\rm L} = \frac{1 - F_{22} / F_{11}}{1 + 2 F_{12} / F_{11} + F_{22} / F_{11}}$$





# Background: Scattering theory

• The physical size of an object can be defined using a size parameter

$$x = \frac{2 \pi a}{\lambda}$$

Rayleigh	Resonance/Mie	Geometric Optics
$r \ll \lambda$	$r \approx \lambda$	$r >> \lambda$



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Light scattering by particles that are larger than the wavelength of the incident light can be solved with the help of ray optics

The 4x4 phase matrix **P** is given by:  $\mathbf{P} = 4\pi \mathbf{F}/k^2 \sigma_{sca}$ 

 $\sigma_{sca}$  = scattering cross-section (the total scattered power). It can be divided into a ray-tracing part and a forward diffraction part

 $\sigma_{sca} = \sigma_{sca}^{RT} + \sigma_{sca}^{D}$ 

The single-scattering albedo  $\omega$  is  $\sigma_{sca}/\sigma_{ext}$ 





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### Background: Scattering theory

• Single scattering vs. multiple scattering

### Single scattering

• Total Field =  $\Sigma$  single fields



### **Multiple scattering**

Radiative transfer equation









# **PART II: Modeling**



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### 1. Optical constants, *m*, retrieval

- Using advanced numerical methods (in geometric optics) and the measured reflectance spectrum of Martian dust analog samples

- narrow size distributions needed for geometric optics!
- m is a parameter that depends on the material, not on the particle shapes or sizes
- measured reflectance spectrum depends on:
  - particle size (smaller particles show higher reflectance)
  - particle shape
  - **-** m
  - $\rightarrow$  important to use accurate particle sizes and shapes for the optical constants retrieval









### 2. Validation of the retrieved optical constants

- Use the derived m to reproduce the observed spectrum of Martian regolith

### 3. Retrieval of scattering properties from the measured scattering matrices

- Full scattering matrix **F** measured for all of the samples at 488 nm and 640 nm for L, M, and S size distributions

- Use the derived *m* together with a scattering database to obtain scattering properties such as the single-scattering albedo, extinction efficiency, and asymmetry factor

- Fine-tune the retrieved *m* 







### Samples: starting point



JSC Mars-1 (Allen et al. 1997): larger than  $200\;\mu m$ 

JSC Mars-1 simulant	MMS-2 simulant	
Glassy, altered volcanic ash from Pu'u Nene, Hawaii	Iron-rich basalt mined from the Western Mojave desert	
Amorphous palagonite, crystallites of plagioclase and magnetite	Crystalline plagioclase, pyroxene, magnetite, and hematite, with trace ilmenite and olivine	<ul> <li>Enhanced Mojave Mars Simulant (MMS- 2, The Martian Garden): larger than</li> </ul>
Glassy in texture	Crystalline in texture	200 μm



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### Samples: processing



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### Samples: processing

1. Larger than 200 microns (experimentally centered at D[4;3]: 275  $\mu$ m)

- 2. Between 100 and 63 microns (centered at D[4;3]: 105  $\mu m$ )
- 3. Between 40 and 20 microns (centered at D[4;3]: 40  $\mu\text{m}$ )



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MMS-2 20-40 µm



### Samples: spectral measurements

• Diffuse reflectance spectra measured at Centro de Instrumentación Científica, University of Granada



If made of the same material and the only difference is the particle size, the spectra should not overlap and the spectral features should not change!

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 $\rightarrow$  different composition?



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### Samples: final selection

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63-100 μm samples are not homogeneous! (larger quartz particles present)

 $\rightarrow$  only 20-40  $\mu$ m samples can be used in the model as homogeneity is assumed





### Optical constants retrieval: samples

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- 20-40  $\mu$ m narrow size distributions in the geometric optics domain (r>> $\lambda$ )
- MGS-1 added to the final selection

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• JSC Mars-1 (Allen et al. 1997)



• Enhanced Mojave Mars Simulant (MMS-2, The Martian Garden)



• Mars Global Simulant (MGS-1, Cannon et al. 2019)







# Optical constants retrieval: Spectral measurements

• Diffuse reflectance spectra measured at Centro de Instrumentación Científica, University of Granada



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# Optical constants retrieval: particle shapes

• Light scattering computations are sensitive to the particle shapes



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Field Emission Scanning Electronic Microscope (FESEM) image of the MMS-2 sample





### Optical constants retrieval: methods RoadMap SIRIS4 (Muinonen et al. 2009, Lindqvist et al. 2018) RT-CB (Muinonen et al. 2004) - simulates light scattering by Gaussian-random-sphere (GRS) particles larger - multiple scattering than the wavelength of the incident light Incident light Reflection Average over SD Incident ray Refraction Backscattered light Ray intensity ~0 Refracted out

### - n fixed to 1.5

- Approach: compute scattering properties for individual sizes (SIRIS4), average over the measured size distribution and use the averaged particles in RT-CB to simulate the surface  $\rightarrow$  compare the retrieved reflectance with the measured spectral value  $\rightarrow$  iterate

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### Optical constants retrieval: first results



GRS1

• 15% maximum uncertainty assumed for the measured reflectance



MMS-2 FESEM image





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### Optical constants retrieval: shapes



Sphere

GRS1

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Polyhedra

GRS2 (spiky)

$\lambda$ (nm)	Sphere	GRS1	Polyhedra	GRS2
400	0.000651	0.000926	0.000926	0.001292
450	0.000514	0.000742	0.000758	0.001017
500	0.000452	0.000666	0.000666	0.000926
550	0.000384	0.000571	0.000578	0.000773
600	0.000330	0.000498	0.000510	0.000681
650	0.000315	0.000468	0.000481	0.000643
400	0.000620	0.000849	0.000869	0.001200
450	0.000575	0.000819	0.000842	0.001139
500	0.000544	0.000788	0.000815	0.001093
550	0.000452	0.000658	0.000669	0.000910
600	0.000193	0.000292	0.000304	0.000407
650	0.000159	0.000243	0.000250	0.000338
400	0.000210	0.000311	0.000320	0.000430
450	0.000201	0.000300	0.000311	0.000414
500	0.000201	0.000300	0.000306	0.000416
550	0.000201	0.000302	0.000307	0.000416
600	0.000199	0.000300	0.000309	0.000414
650	0.000208	0.000315	0.000320	0.000433
	$\lambda$ (nm) 400 550 550 600 650 400 450 550 600 650 400 450 550 600 550 600 650	λ (nm)         Sphere           400         0.000651           450         0.000452           550         0.000384           600         0.000315           400         0.000620           450         0.000514           650         0.000315           400         0.000575           500         0.000544           550         0.000542           660         0.000543           550         0.000544           550         0.000193           650         0.000193           650         0.000210           450         0.000211           550         0.000201           550         0.000201           550         0.000201           550         0.000201           550         0.000201           660         0.000201	λ (nm)         Sphere         GRS1           400         0.000651         0.000926           450         0.000514         0.000742           500         0.000452         0.000666           550         0.000304         0.000514           600         0.000303         0.000498           650         0.000315         0.000484           400         0.000575         0.000849           450         0.000575         0.000584           550         0.000542         0.000584           660         0.000193         0.000292           650         0.000193         0.000291           400         0.000201         0.000301           400         0.000201         0.000301           550         0.000201         0.000301           400         0.000201         0.000301           500         0.000201         0.000302           500         0.000201         0.000302           500         0.000201         0.000302           500         0.000201         0.000302           500         0.000201         0.000302           500         0.000201         0.000302	λ (nm)SphereGRS1Polyhedra4000.0006510.0009260.0009264500.0005140.0007420.0007585000.0004520.0006660.0006665500.0003840.0005710.0005786000.0003050.0004980.0004816000.0003050.0004980.0008424000.0005750.0008490.0008425000.0005750.0008490.0008425000.0005750.0007880.0008425500.0004520.0006580.0006696000.0001930.002200.0003046500.0002100.0003110.0003204500.0002010.0003000.0003065500.0002010.003000.0003065500.0002010.003020.0003076000.0001990.003030.0003066500.0002080.0003050.000307



• The derived *k* increases when the particle irregularity increases



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### Optical constants retrieval: n

	$\lambda$ (nm)	n = 1.4	n = 1.5	n = 1.6
JSC Mars-1	200	0.000946	0.001067	0.001138
	300	0.001211	0.001296	0.001467
	400	0.000864	0.000926	0.000956
	450	0.000712	0.000742	0.000742
	500	0.000651	0.000666	0.000666
	550	0.000552	0.000571	0.000559
	600	0.000483	0.000498	0.000483
	650	0.000460	0.000468	0.000460
	1000	0.000709	0.000721	0.000709
	1250	0.000904	0.000899	0.000880
	1500	0.001028	0.001036	0.001017
	1750	0.001096	0.001104	0.001085
	2000	0.001183	0.001192	0.001163
MMS-2	200	0.000523	0.000561	0.000583
	300	0.000719	0.000751	0.000783
	400	0.000819	0.000849	0.000864
	450	0.000803	0.000819	0.000834
	500	0.000773	0.000788	0.000788
	550	0.000643	0.000658	0.000658
	600	0.000292	0.000292	0.000284
	650	0.000245	0.000243	0.000239
	1000	0.000184	0.000184	0.000178
	1250	0.000189	0.000184	0.000182
	1500	0.000230	0.000227	0.000221
	1750	0.000255	0.000250	0.000238
	2000	0.000289	0.000287	0.000273
MGS-1	200	0.000372	0.000387	0.000402
	300	0.000420	0.000431	0.000442
	400	0.000308	0.000311	0.000311
	450	0.000300	0.000300	0.000300
	500	0.000300	0.000300	0.000294
	550	0.000296	0.000302	0.000292
	600	0.000300	0.000300	0.000296
	650	0.000311	0.000315	0.000308
	1000	0.000590	0.000596	0.000587
	1250	0.000597	0.000606	0.000587
	1500	0.000675	0.000685	0.000665
	1750	0.000811	0.000816	0.000802
	2000	0.000860	0.000880	0.000841

- Is it OK to assume *n* = 1.5 over the entire wavelength range?
- The derived *k* is not sensitive to the changes in *n* when the retrieval is carried out using the measured reflectance spectrum





RoadMap



- How well do the analogues represent the Martian surface?
- The observed NOMAD UVIS spectrum (Willame et al. 2022): a relatively high visible albedo region with a limited impact from the atmosphere; no ice clouds, the amount of dust was low, and the solar zenith angle was small
- Bidirectional reflectance computations carried out using the derived refractive indices, SIRIS4, and Radiative Transfer and Coherent Backscattering (RT-CB) code (Muinonen et al. 2004)





### Optical constants retrieval: validation



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- Previous studies: particle sizes < 100 μm, bright region particle SD can be in the range of 2 40 μm (Ruff & Christensen 2002, Christensen 1986)</li>
- To better simulate the surface, we created a broad normal size distribution in the range of  $2-40 \ \mu m$  and repeated the bidirectional reflectance computations for the MMS-2 analogue
- Compared with computations that were performed by using the optical constants in the literature (Wolff et al. 2009)





### Optical constants retrieval: validation



- Modelled slope in the UV not as steep as for the observed spectrum
- Differences between the retrieved  $\mathbf{k}$  and the values in the literature could be explained by:
  - different particle shapes
  - different composition of the surface regolith compared to the lifted atmospheric dust (compositional separation??)



RoadMap





### Compositional separation?

MMS-2 20-40 µm





- The composition changes slightly when separating the particles by size. According to XRD, the  $20-40 \ \mu m$  fraction shows quartz as the main phase, which explains the more whitish colour of the powder. For this reason, this fraction was again prepared from the previously milled MMS-2 powder.
- To what extent could the compositional separation operate on Mars?

Published in Martikainen et al. 2023, ApJS (in press)





## Scattering properties: measurements

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- COsmic DUst LABoratory (CODULAB, Muñoz et al. 2012)
   → measure the scattering matrix elements F11, F12, F22, F33, F34, and F44 of the Martian dust analogues at 488nm and 640nm
- Retrieval of the scattering properties by using the known particle size distributions, measured scattering matrix elements, derived complex refractive indices, and a scattering database







RoadMap





• Two approaches:

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Compute the scattering properties from the scratch using advanced numerical methods
 Problem: various particle size distributions and materials, computationally heavy. Changing parameters results in new computations.

2. Use a scattering database to retrieve the scattering properties

- Pre-calculated scattering properties over a wide range of particle sizes, refractive indices, and wavelengths

- How to select the "ideal" particle shape?
  - Try to reproduce the laboratory measurements by using databases that utilize different particle shapes  $\rightarrow$  use the database that produces the best fit





# Scattering properties: scattering databases

OR





### TAMUdust2020, Saito et al. 2021

Tri-axial ellipsoids, Meng et al. 2010





# Scattering properties: tri-axial ellipsoids

- Download: https://zenodo.org/record/4959767#.YnjcCC0RrRX
- Tri-axial ellipsoid database by Meng et al. 2010
  - Pre-calculated data:
    - 42 shapes
    - Axis ratios ranging from 1 to 3.3
    - 69 refractive indices:  $m_{re} \in [1.1, 2.1], m_{im} \in [0.0005i, 0.5i]$
    - 471 entries for size parameters, **x**, ranging from 0.025 to 1000
- 34 shapes selected: contain 1 sphere, 6 prolate and 6 oblate spheroids, ellipsoids
  - Nearly spherical shapes were omitted (Merikallio et al. 2013)

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- Equiprobable shape distribution

average

$$P(\theta) = \frac{\sum_{i} \eta_{i} \sum_{r} n_{r} C_{\text{sca}}(r, i) P(\theta, r, i)}{\sum_{i} \eta_{i} \sum_{r} n_{r} C_{\text{sca}}(r, i),}$$





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# Scattering properties: hexahedra

- Download: https://sites.google.com/site/masanorisaitophd/data-and-resources/tamudust2020
- Ensemble of 20 hexahedral particles
- SW (shortwave) and LW (longwave) domains

- SW:  $m_{re} = 1.37 - 1.7$ ,  $m_{im} = 0.0001 - 0.1$ , x ranges from Rayleigh to 11800

- LW:  $m_{re} = 0.4 - 3.2$ ,  $m_{im} = 0.001-4.0$ , x ranges from Rayleigh to 1450



• Sphericity parameter defines the mixing rate of different irregular shapes within the ensemble (0.695 - 0.785)

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- Small value  $\rightarrow$  higher aspect ratio
- 0.695 for dust particles

#### average

$$\mathbf{P}(\theta) \rangle = \frac{\int_{D_{\min}}^{D_{\max}} n(D) A(D, \Psi) Q_{\text{sca}}(D, m_r, m_i, \Psi) \mathbf{P}(\theta, D, m_r, m_i, \Psi) dD}{\int_{D_{\min}}^{D_{\max}} n(D) A(D, \Psi) Q_{\text{sca}}(D, m_r, m_i, \Psi) dD}$$







# Scattering properties: palagonite test

- Scattering matrix measurements of palagonite at 632.8nm
- Testing with spheres, tri-axial ellipsoids, and hexahedra shapes
- Complex refractive index m fixed to 1.6+i0.0005 according to the best-fit solution carried out by Merikallio et al. 2013









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### Scattering properties: palagonite test



The hexahedra database produces best fits

 $\rightarrow$  selected to be used for the scattering properties retrieval of Martian dust

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![](_page_40_Picture_4.jpeg)

![](_page_40_Picture_6.jpeg)

### Scattering properties: MMS-2 SD L

• Single-scattering properties modelled using the hexahedra database + k(GRS2) + measured SD

![](_page_41_Figure_2.jpeg)

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![](_page_41_Picture_3.jpeg)

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### Scattering properties: MMS-2 SD L

![](_page_42_Figure_1.jpeg)

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![](_page_42_Picture_2.jpeg)

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### Scattering properties: MMS-2 SD L

• Sphericity

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![](_page_43_Figure_2.jpeg)

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![](_page_43_Picture_3.jpeg)

![](_page_43_Picture_5.jpeg)

### Scattering properties: MMS-2 SD M

![](_page_44_Figure_1.jpeg)

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![](_page_44_Picture_2.jpeg)

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### Scattering properties: MMS-2 SD M

MMS-2 M, 488nm, k(GRS2) 10<sup>3</sup> 0.2 488nm measured • 0.15 10<sup>2</sup> n=1.4 n=1.5 0.1 -P12/P11 n=1.6 10<sup>1</sup> P11 10<sup>0</sup> 0 10<sup>-1</sup> -0.05 10<sup>-2</sup> -0.1 20 100 20 0 40 60 80 120 140 160 180 0 40 60 80 100 120 140 160 Scattering angle (degrees) Scattering angle (degrees)

![](_page_45_Figure_2.jpeg)

![](_page_45_Picture_3.jpeg)

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![](_page_45_Picture_4.jpeg)

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![](_page_46_Picture_0.jpeg)

- We used an advanced light scattering model together with laboratory measurements to retrieve optical constants for three martian dust analogues: JSC Mars-1, MMS-2, and MGS-1
  - Sensitivity tests showed that the retrieved values are sensitive to the particle shape
- The selected particle shape should reproduce well the measured reflectance spectrum and the scattering matrix
  - Spheres, tri-axial ellipsoids, and hexahedra particles were tested on palagonite  $\rightarrow$  the hexahedra particles produced the best fits to the measurements
- We are currently working on retrieving the scattering properties of martian dust analogues from their measured scattering matrices by using the derived optical constants, measured particle size distributions, and the hexahedra database

![](_page_46_Picture_6.jpeg)

![](_page_46_Picture_8.jpeg)

![](_page_47_Picture_0.jpeg)

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![](_page_47_Picture_2.jpeg)

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![](_page_47_Picture_4.jpeg)

![](_page_47_Picture_6.jpeg)