

# Modelling Hierarchical Clustering — Examples in action

Tim Connors

tconnors@astro.swin.edu.au

Swinburne University

Supervisors: Prof. Brad Gibson

Dr. Daisuke Kawata

Dr. Paul Nulsen

## Abstract

Through the investigation of the closest group of interacting galaxies, the Magellanic Clouds and Milky Way Galaxy, we hope to understand the process of Hierarchical clustering in more detail.

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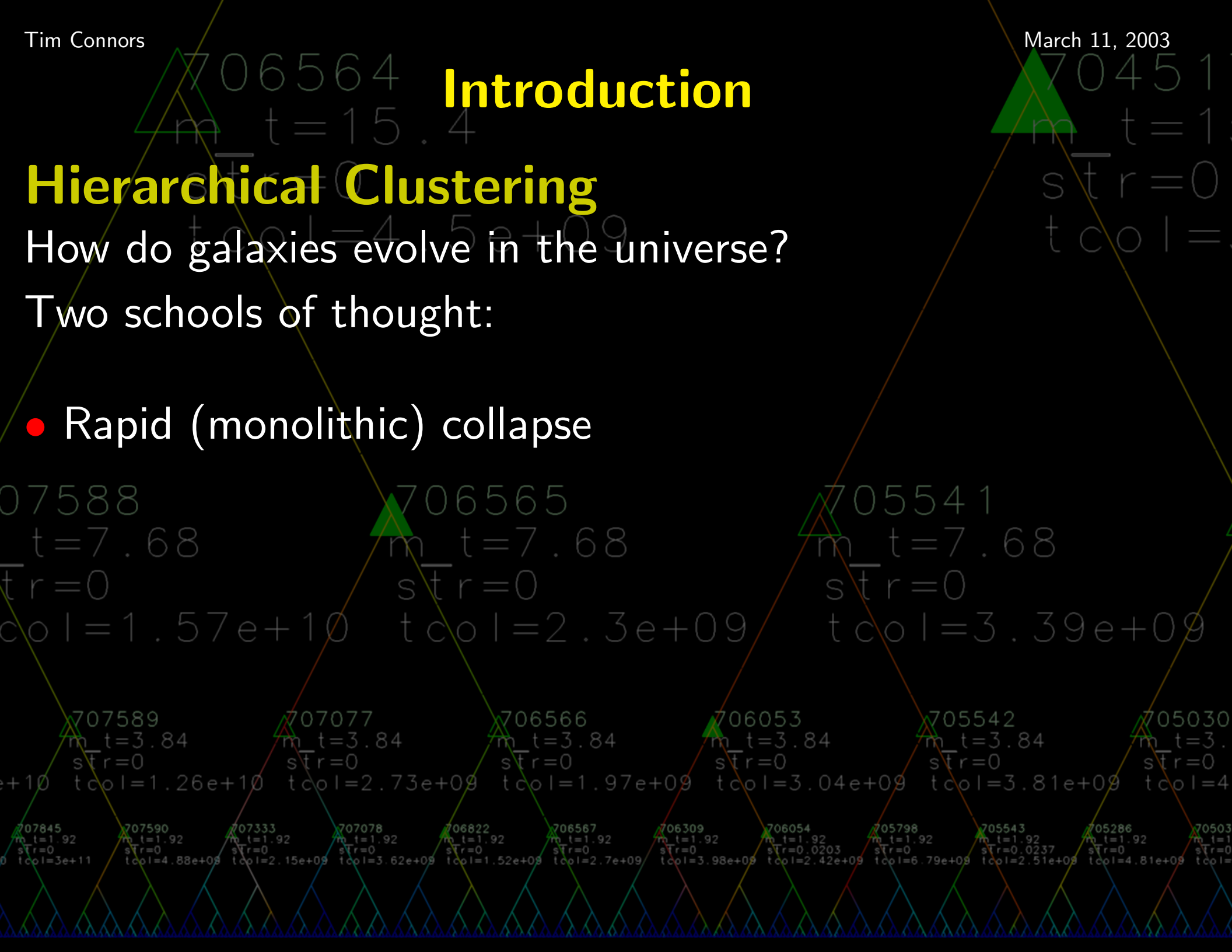
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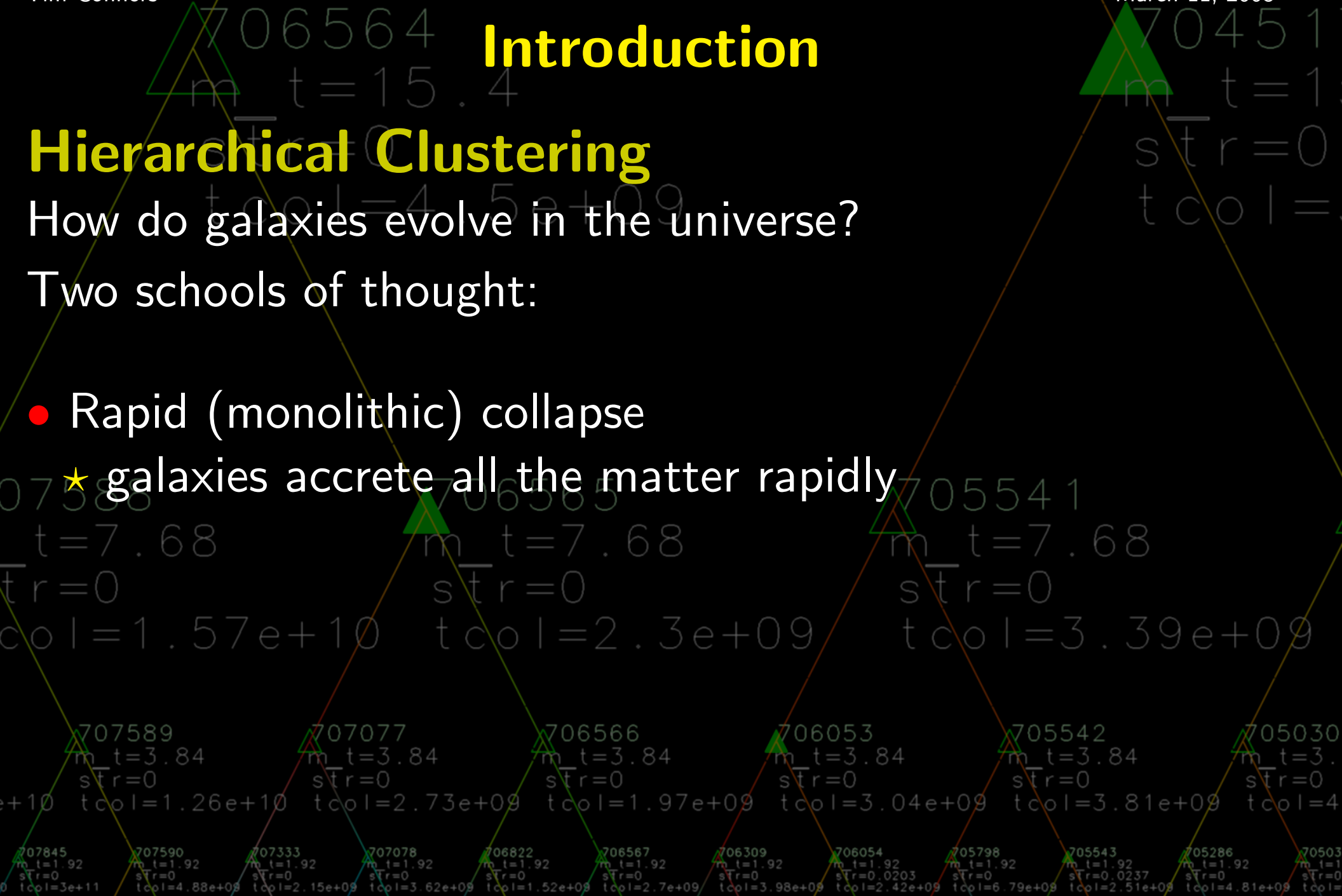
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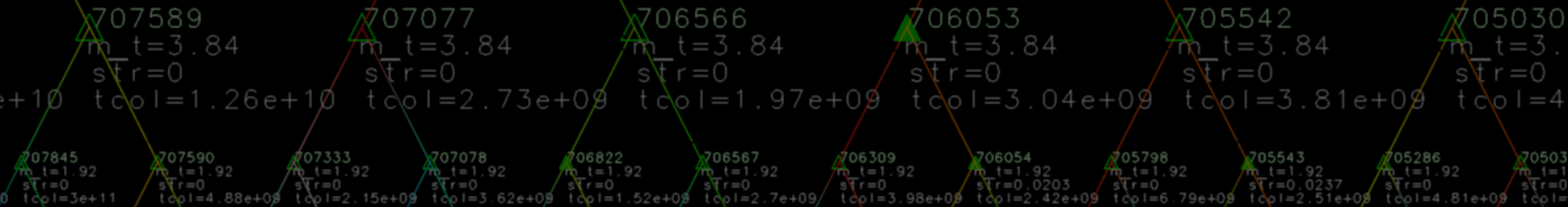
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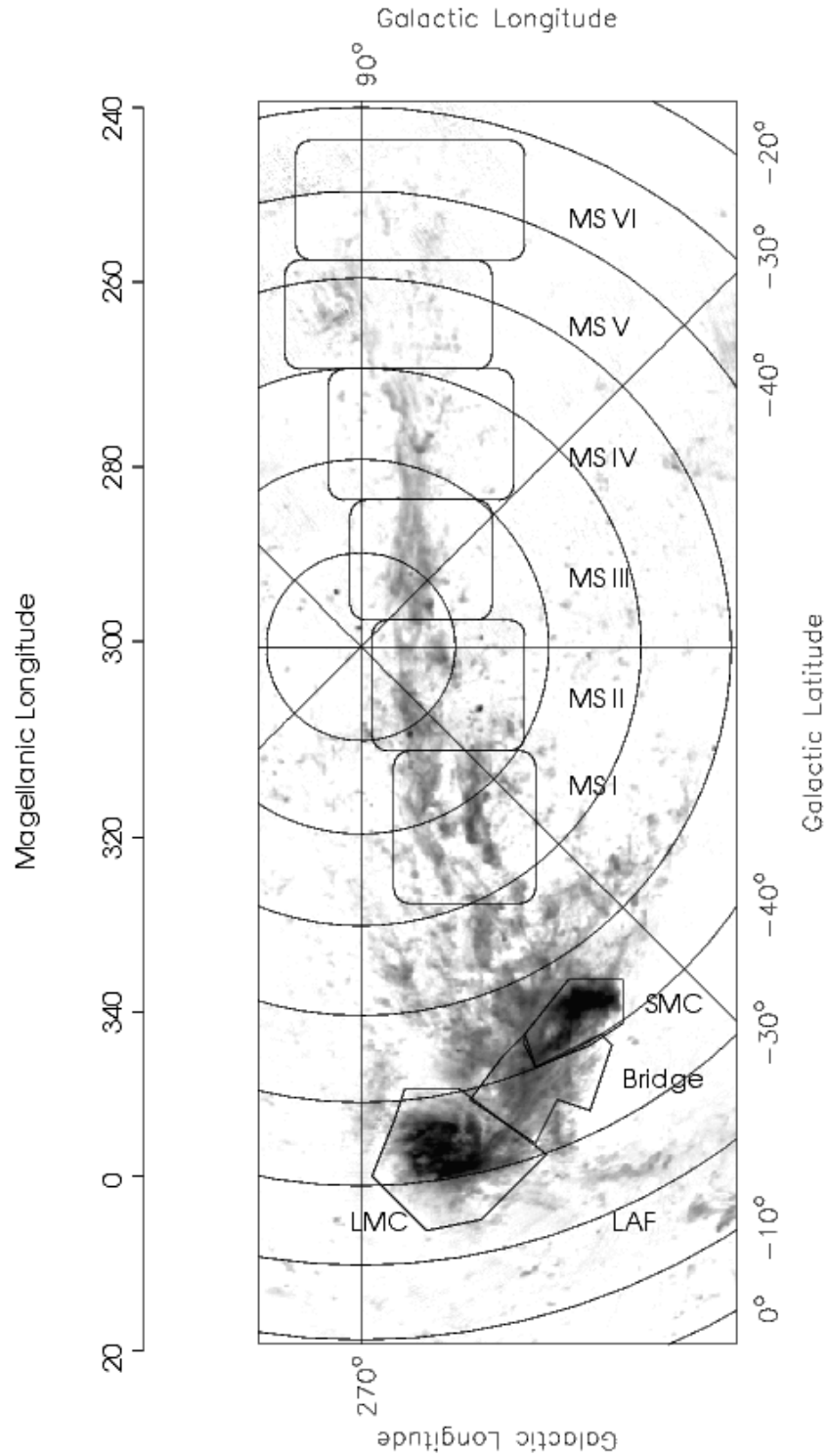
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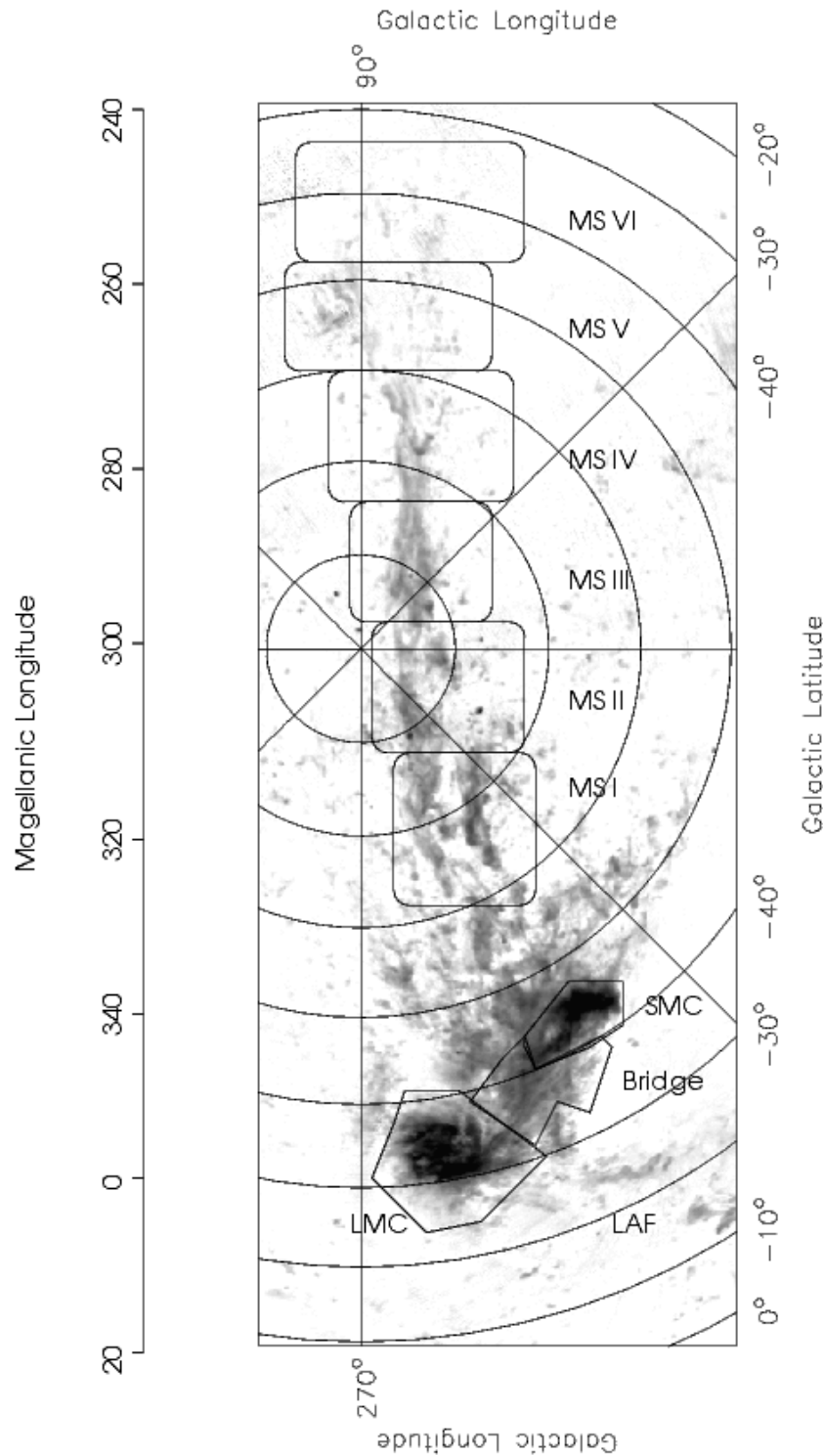
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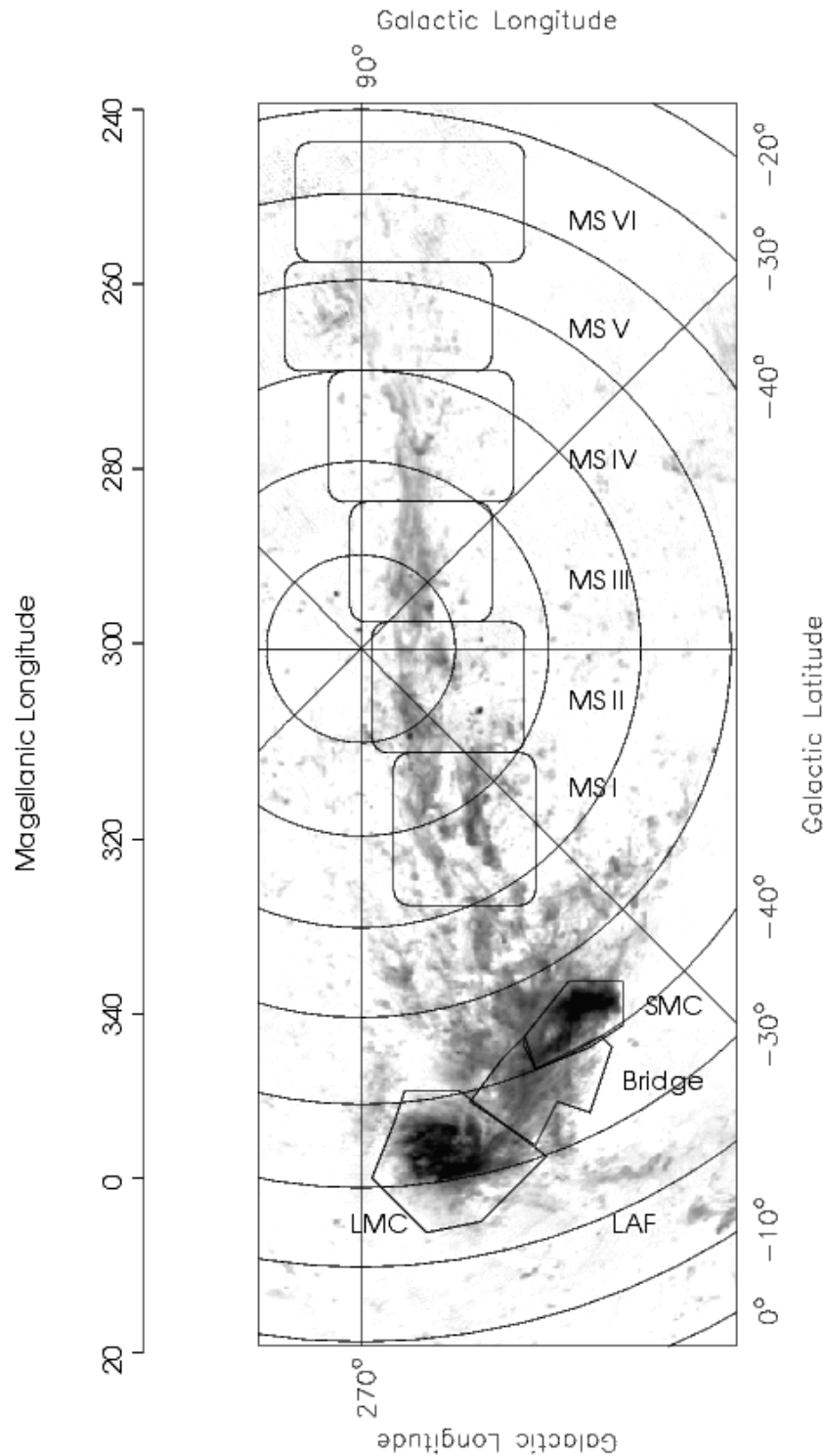


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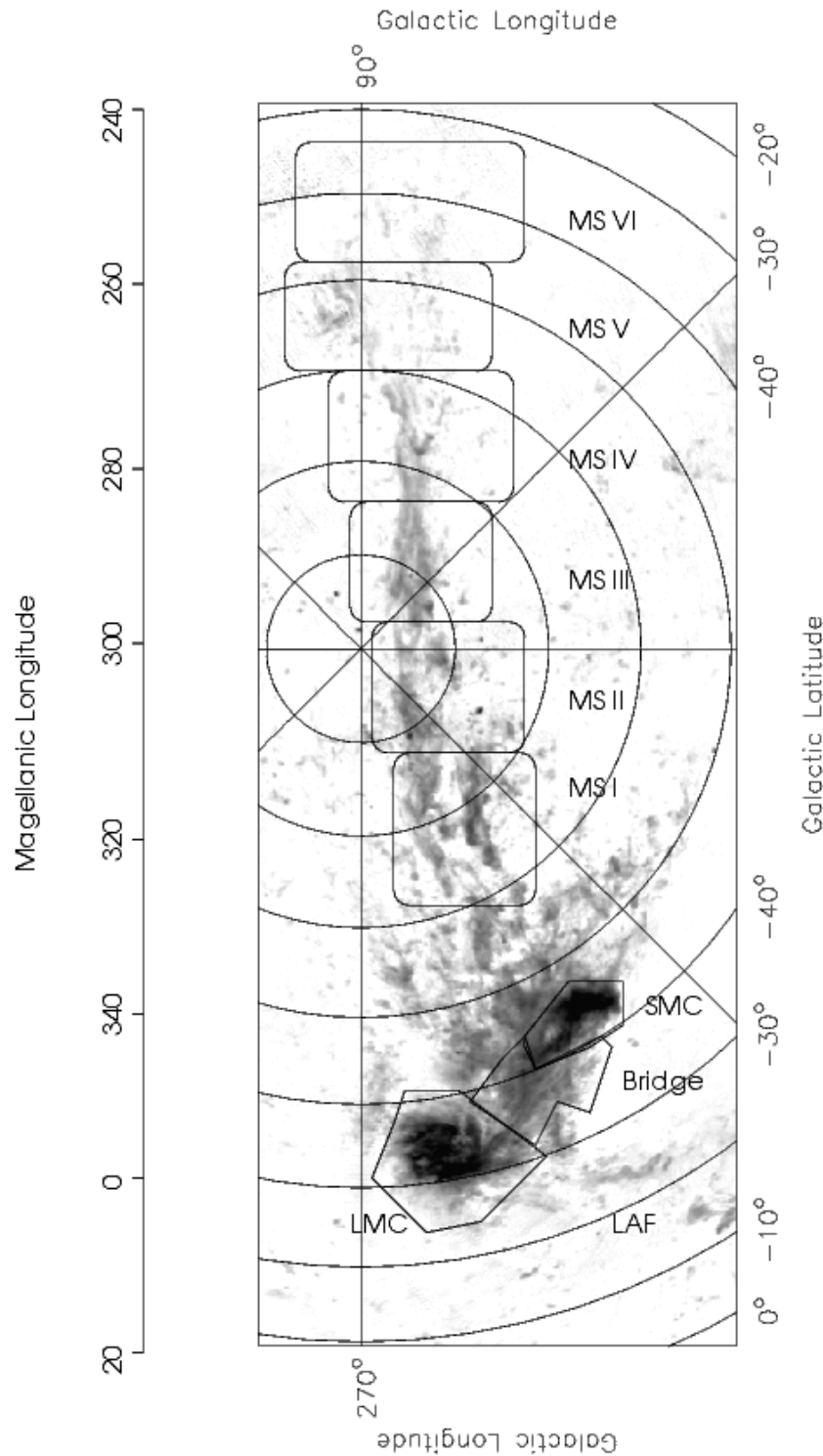
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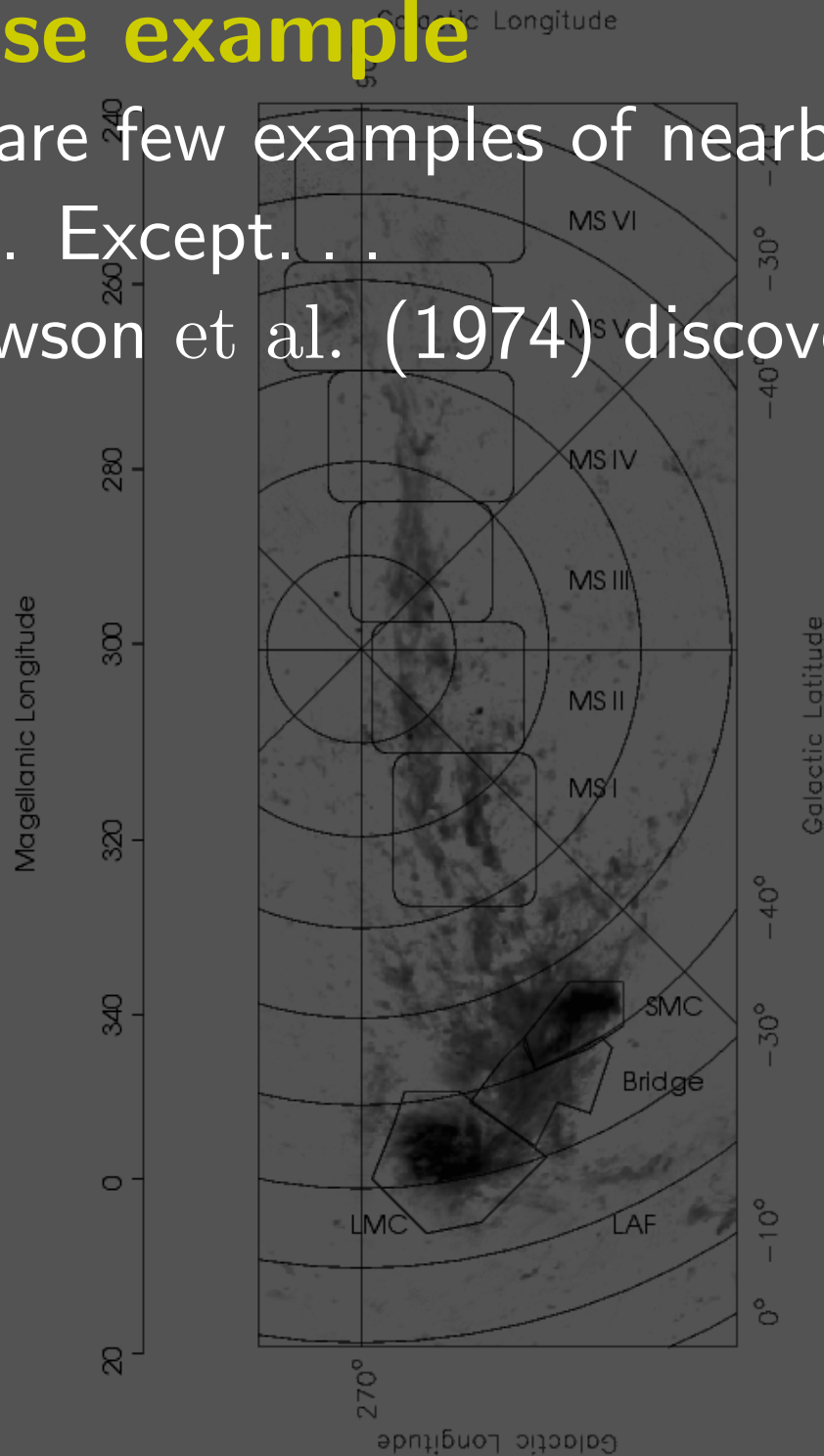
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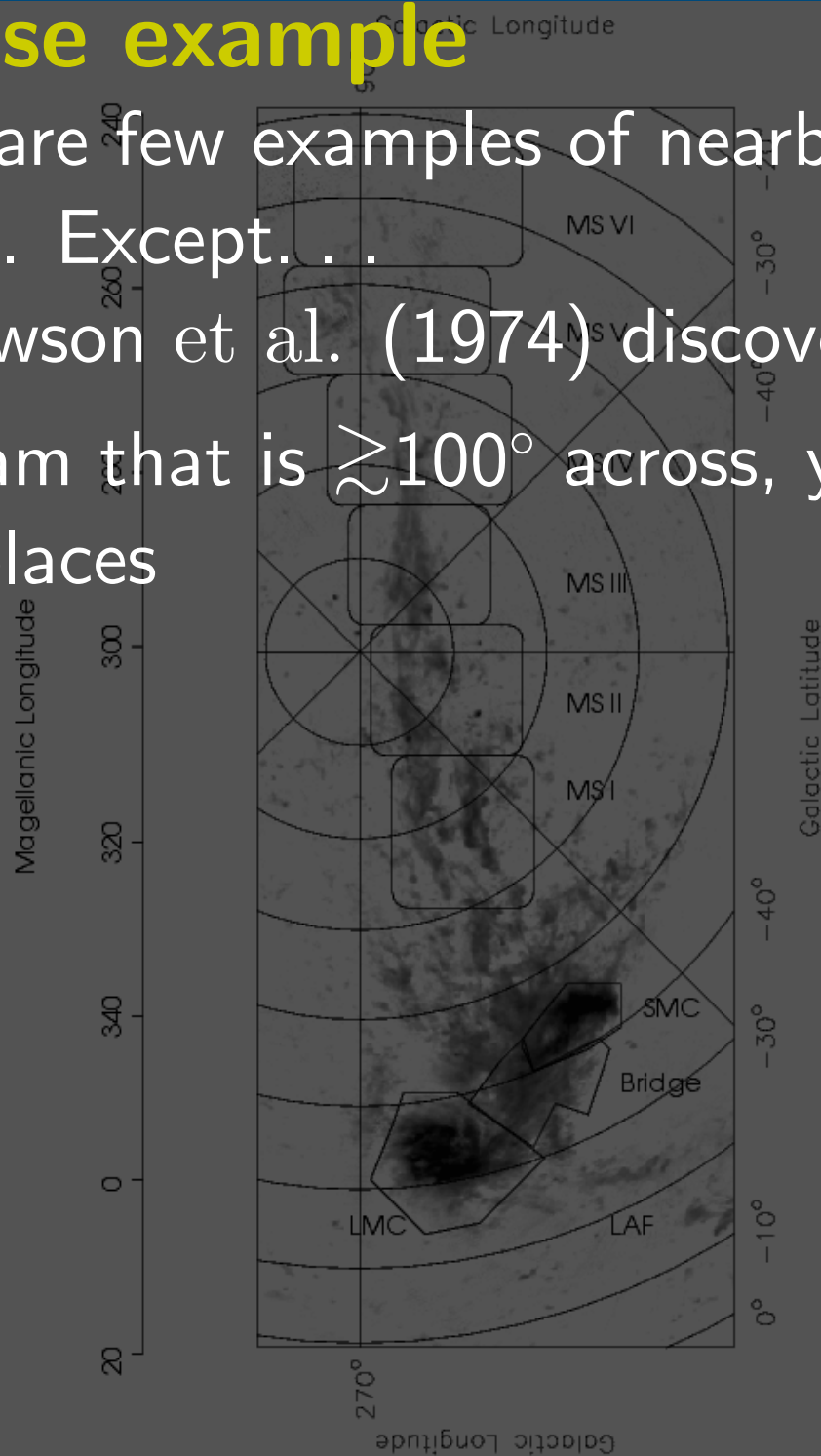


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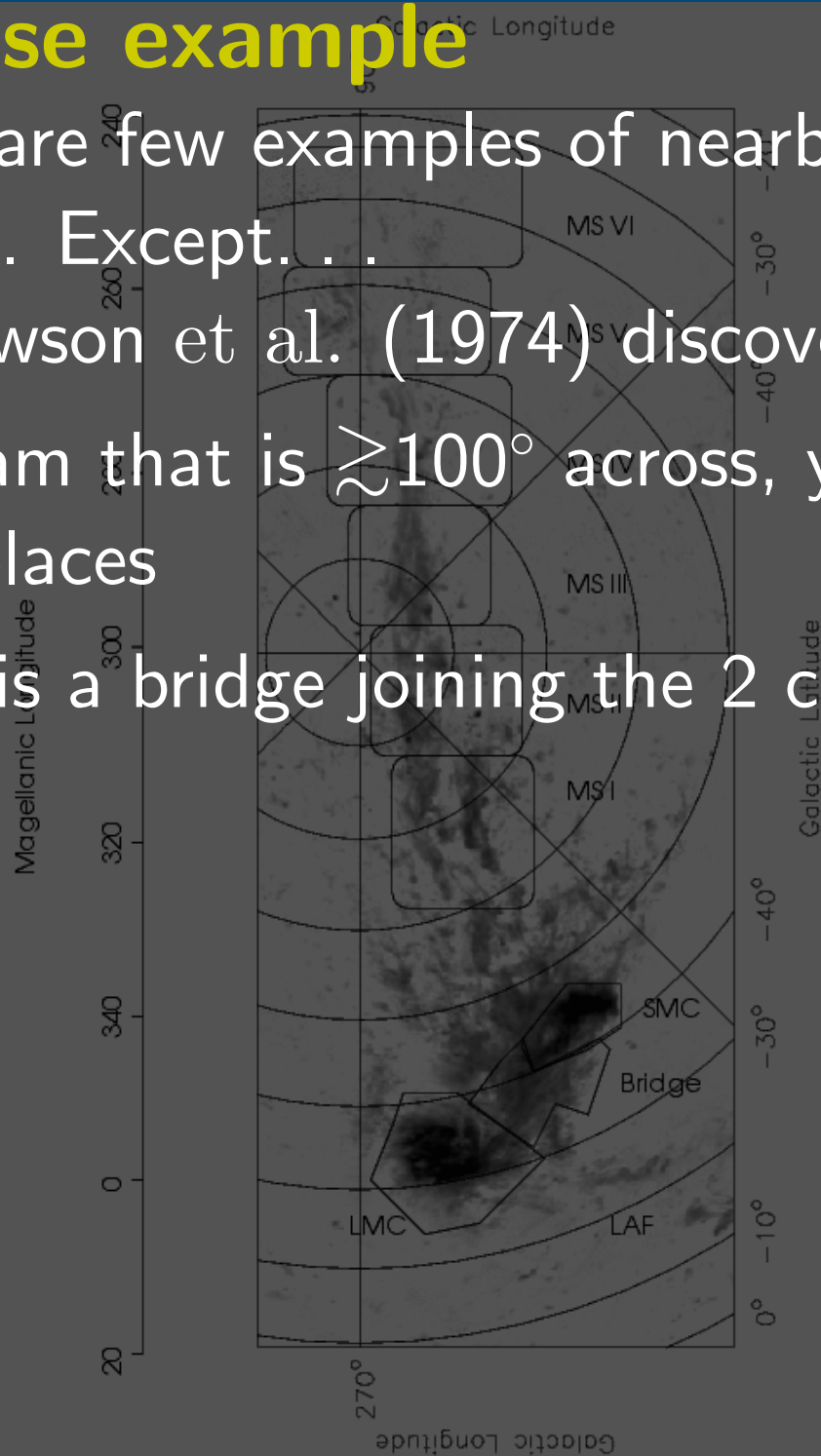
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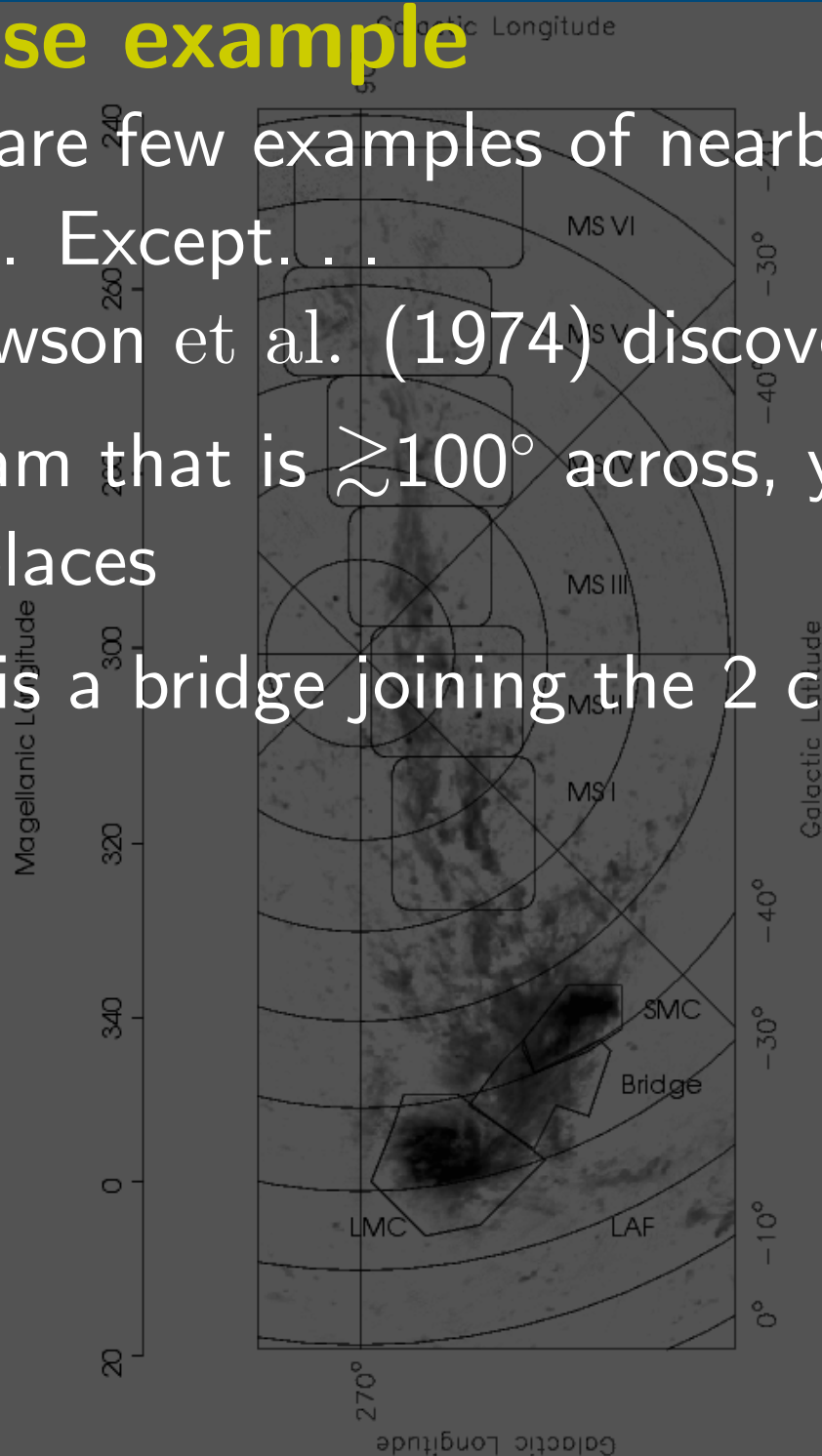
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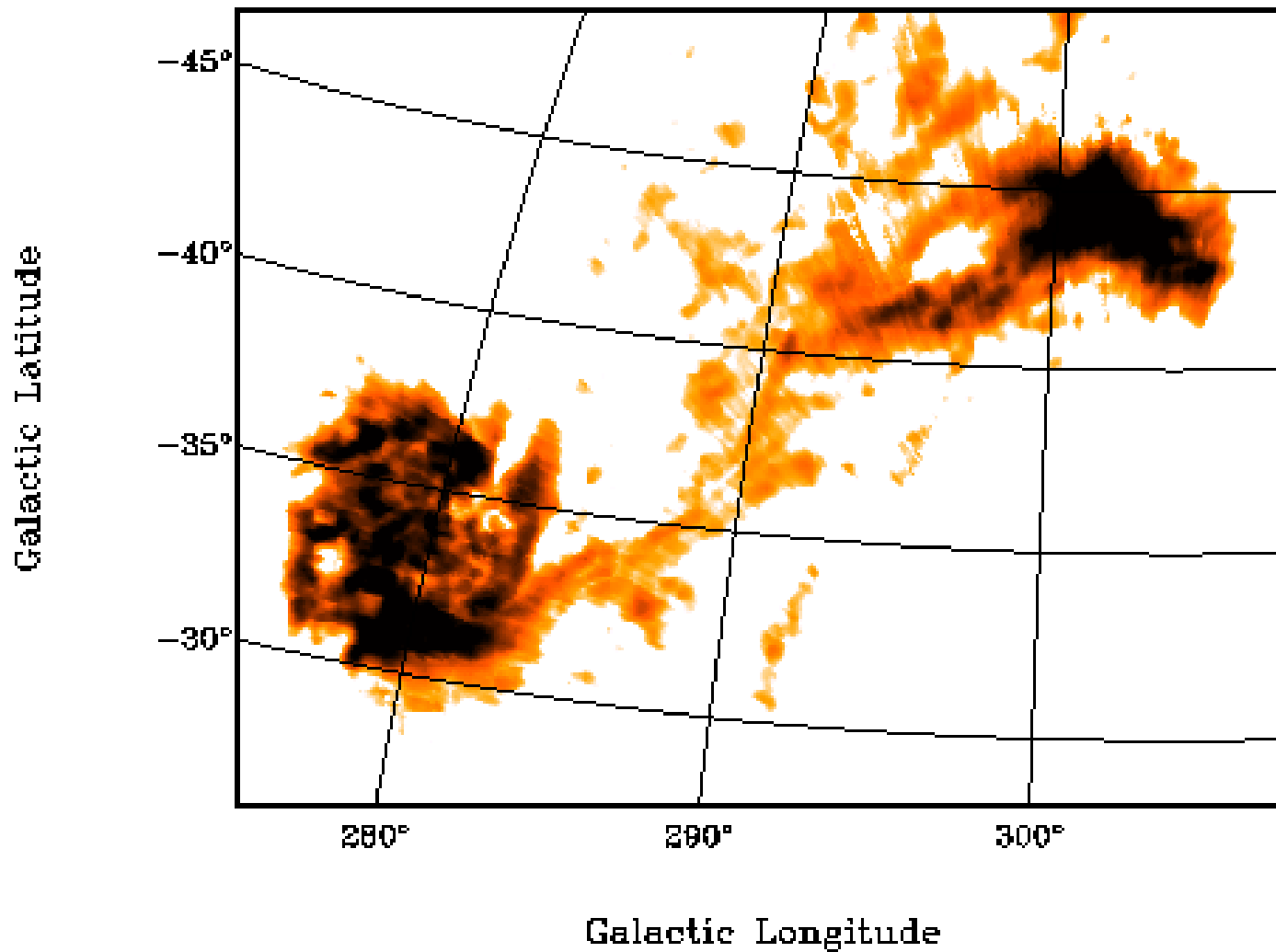
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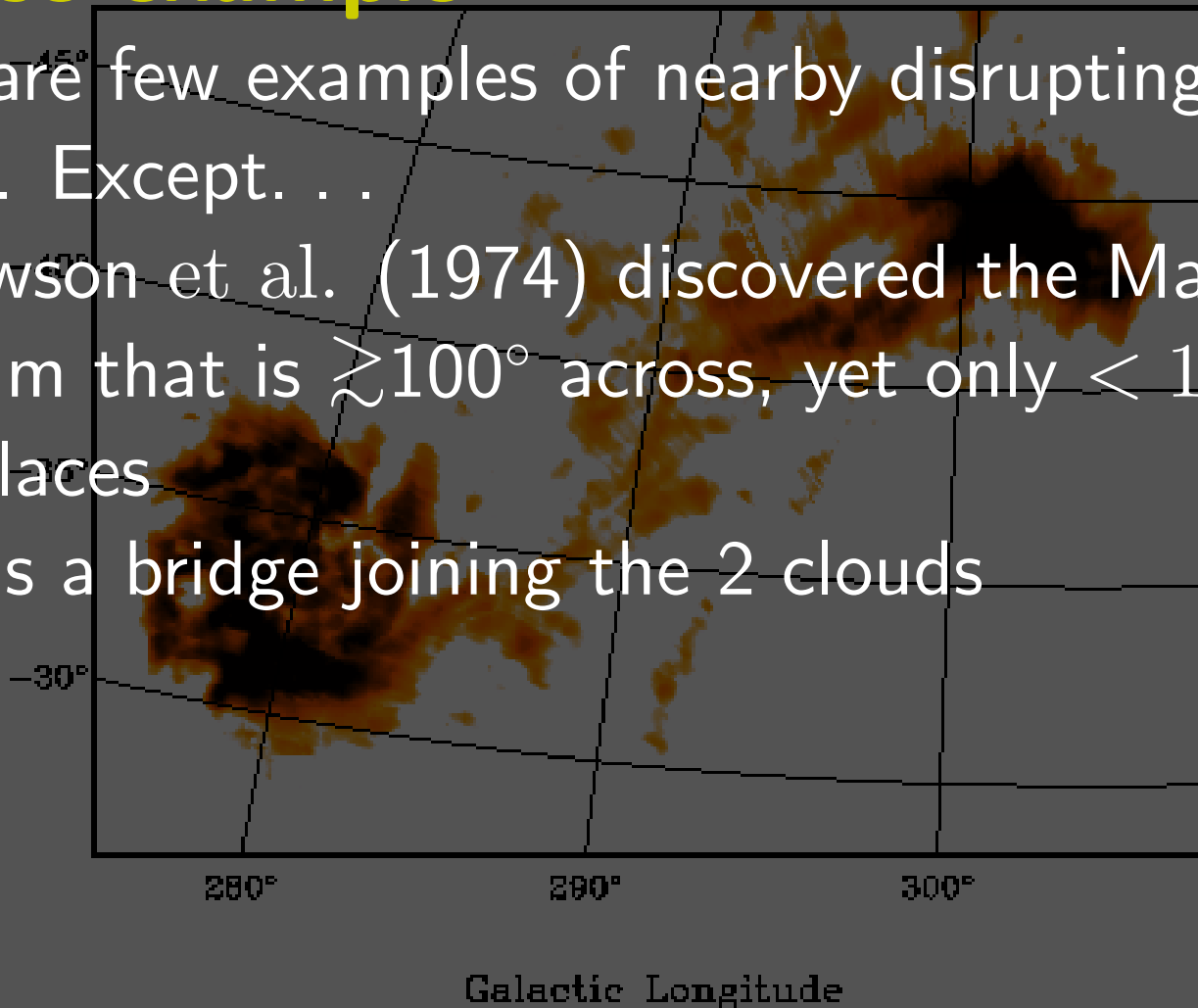
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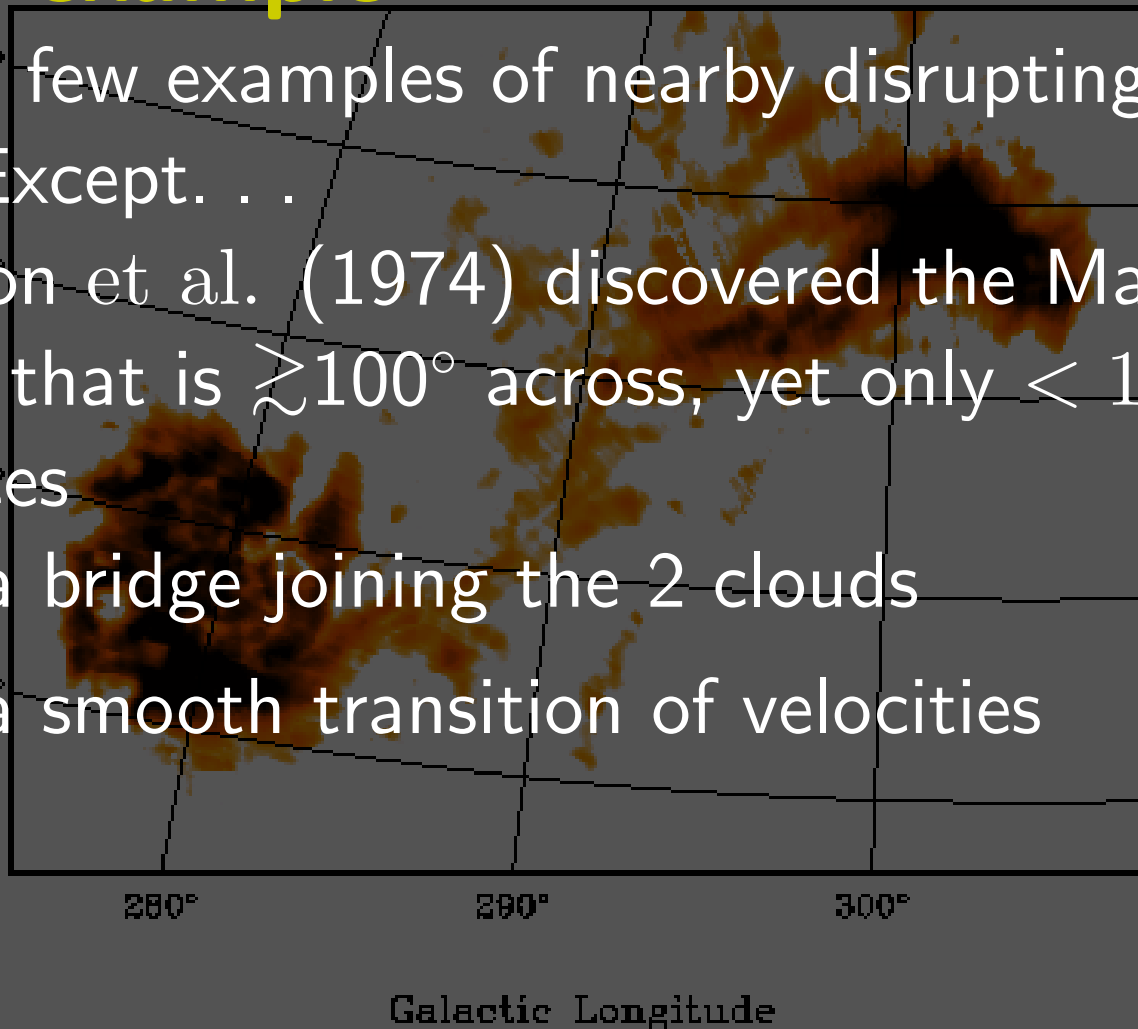
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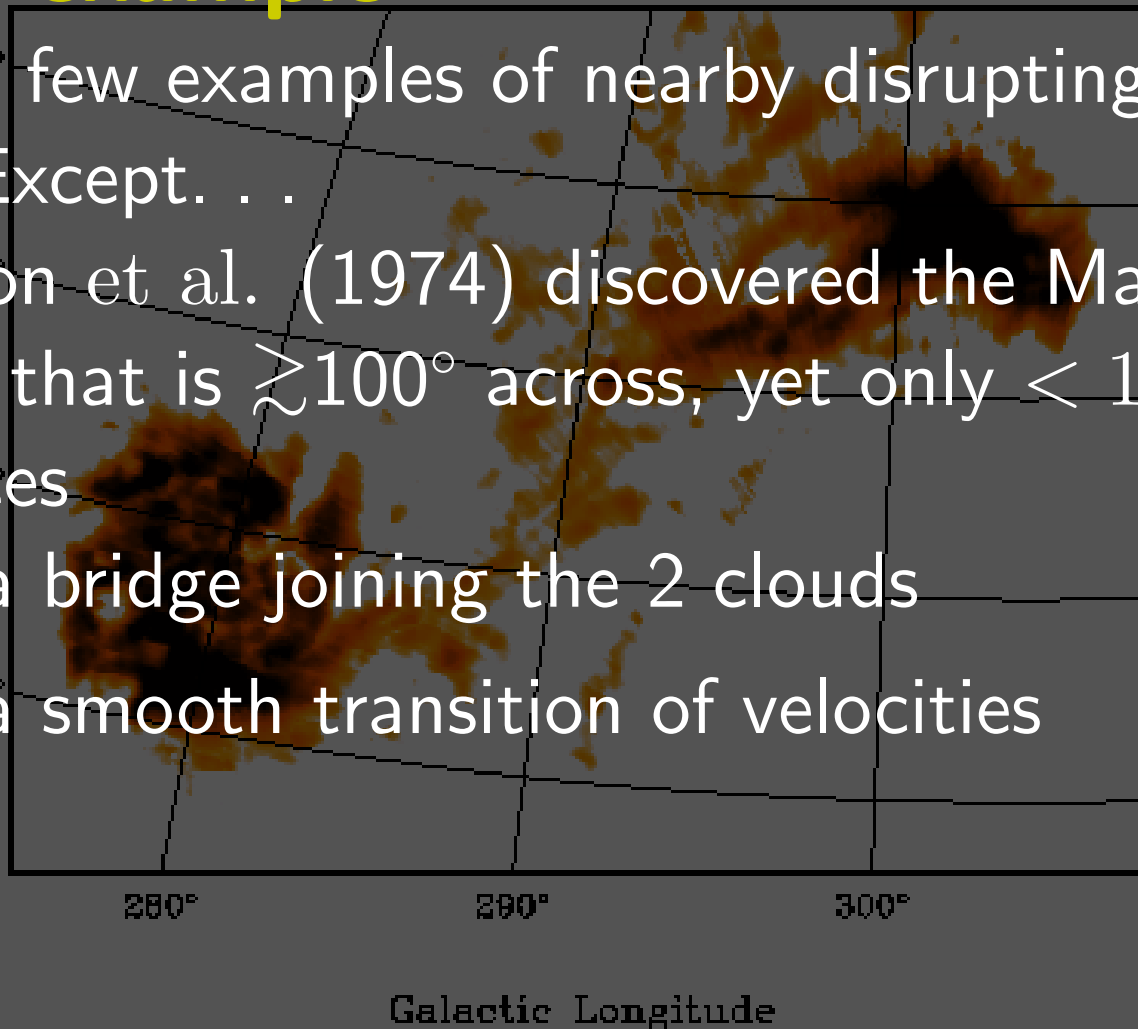
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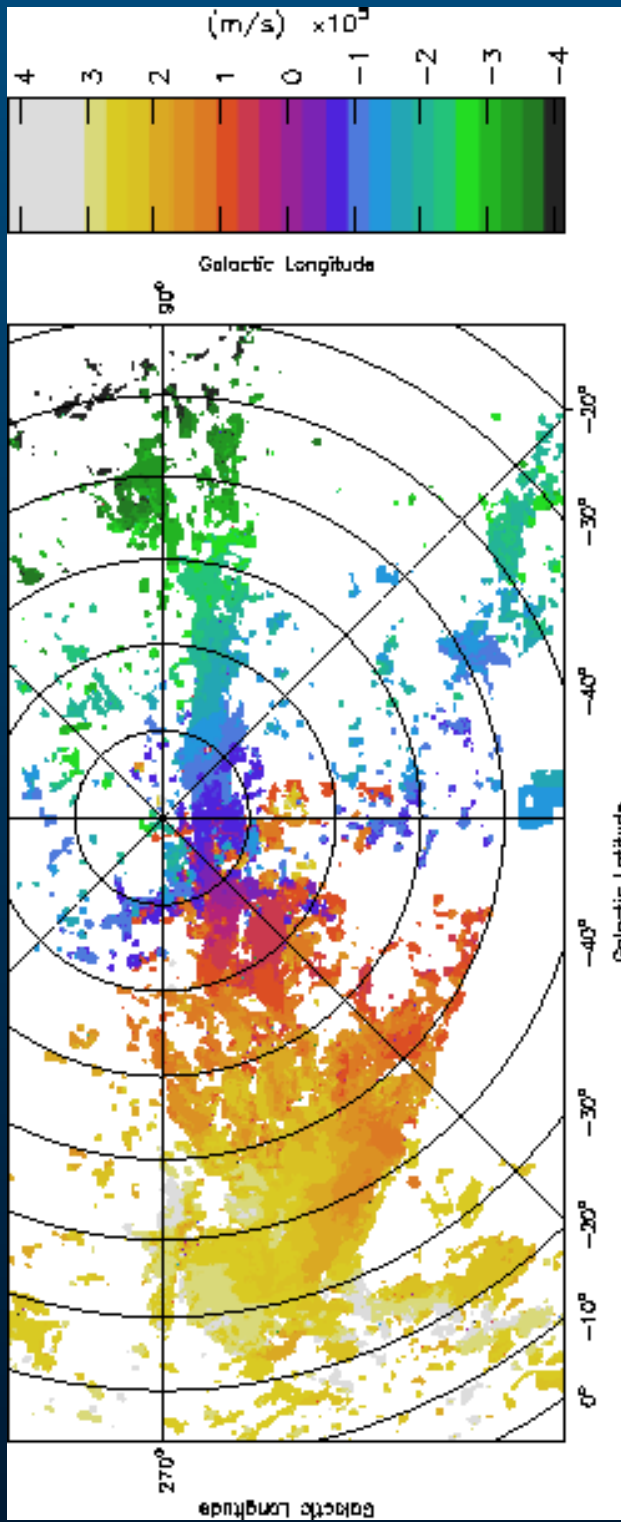
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Velocity gradient (Putman et al. 2001, astro-ph/0209127)



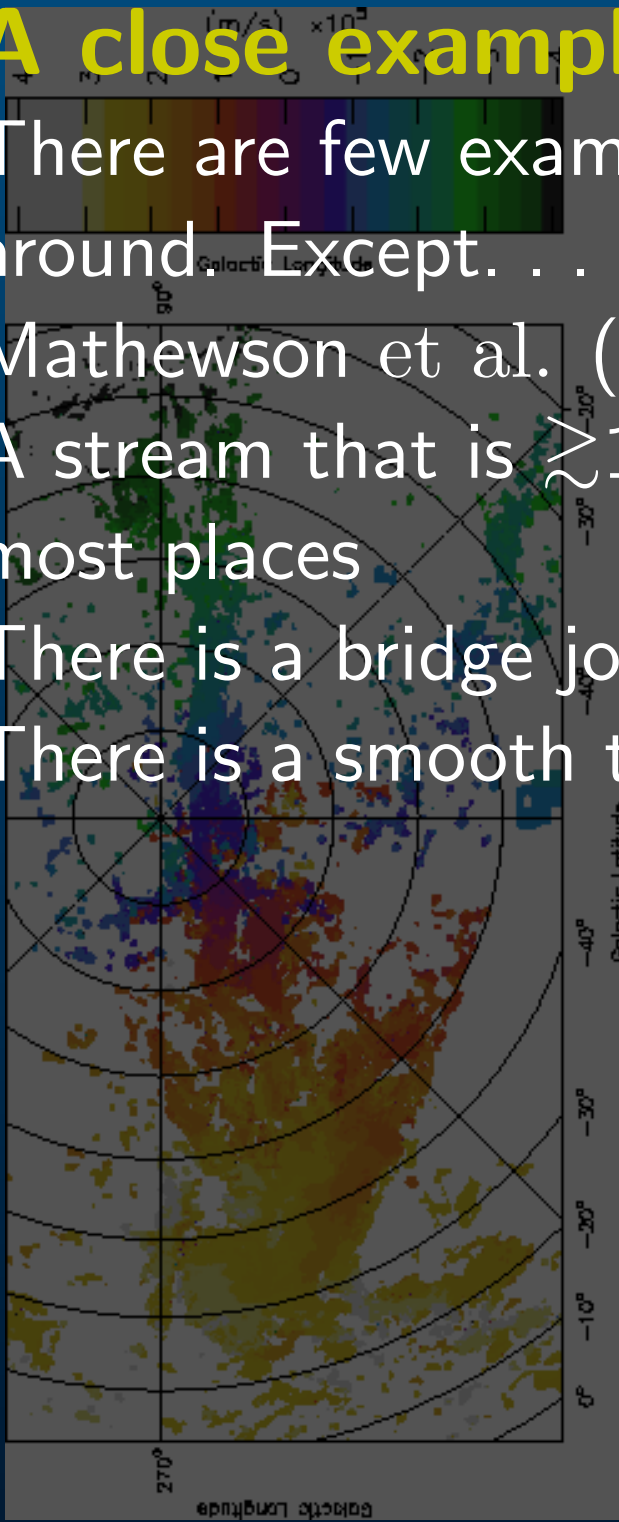
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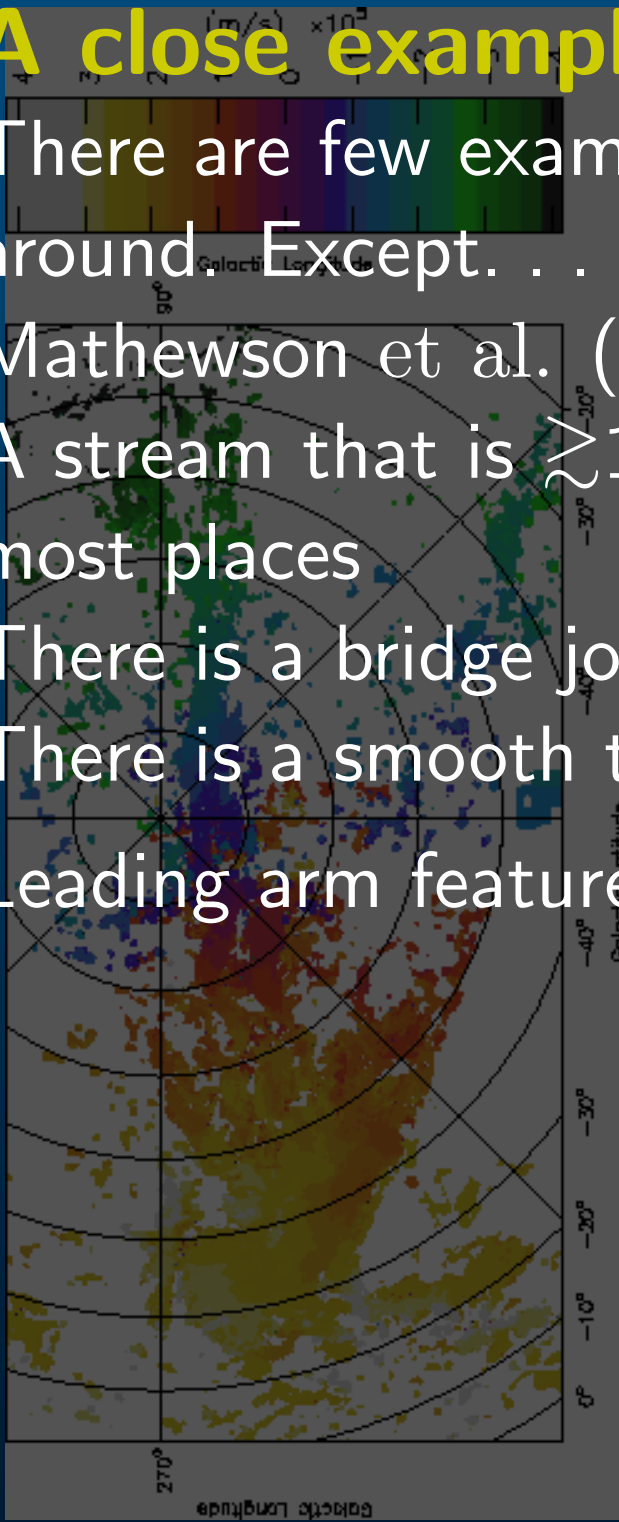
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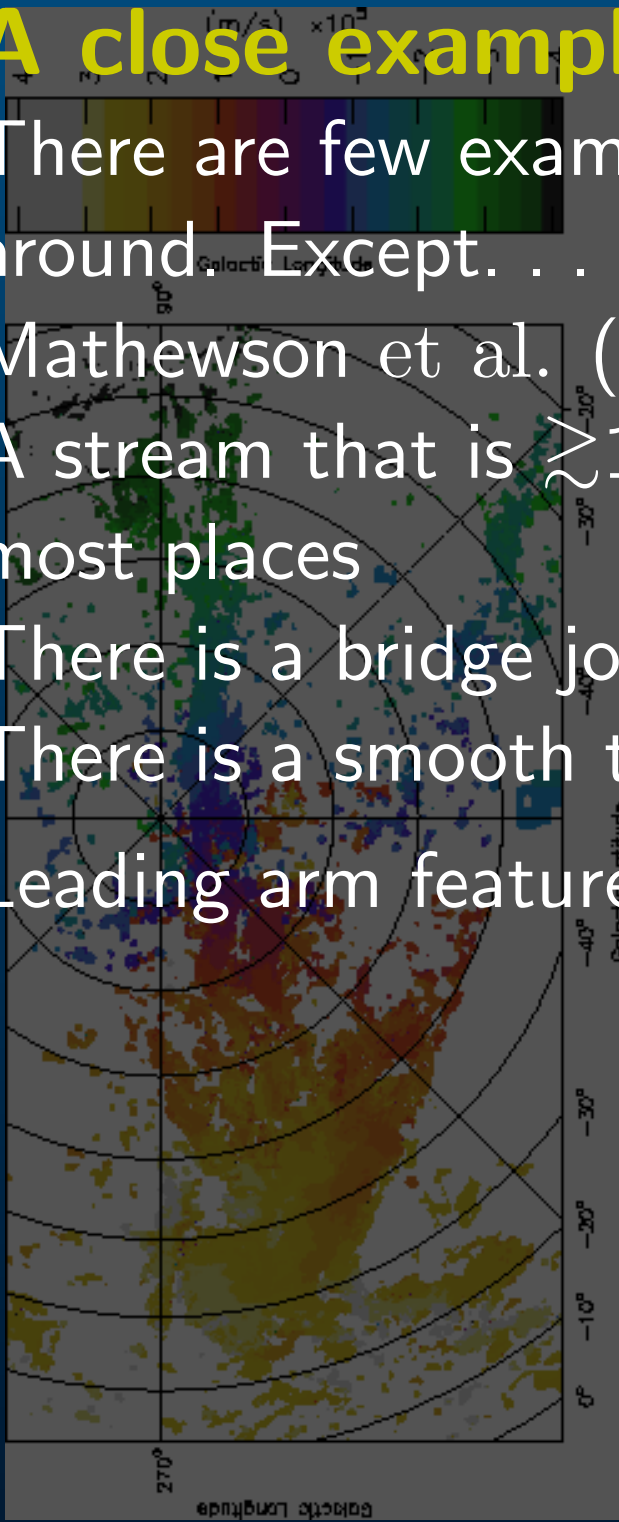
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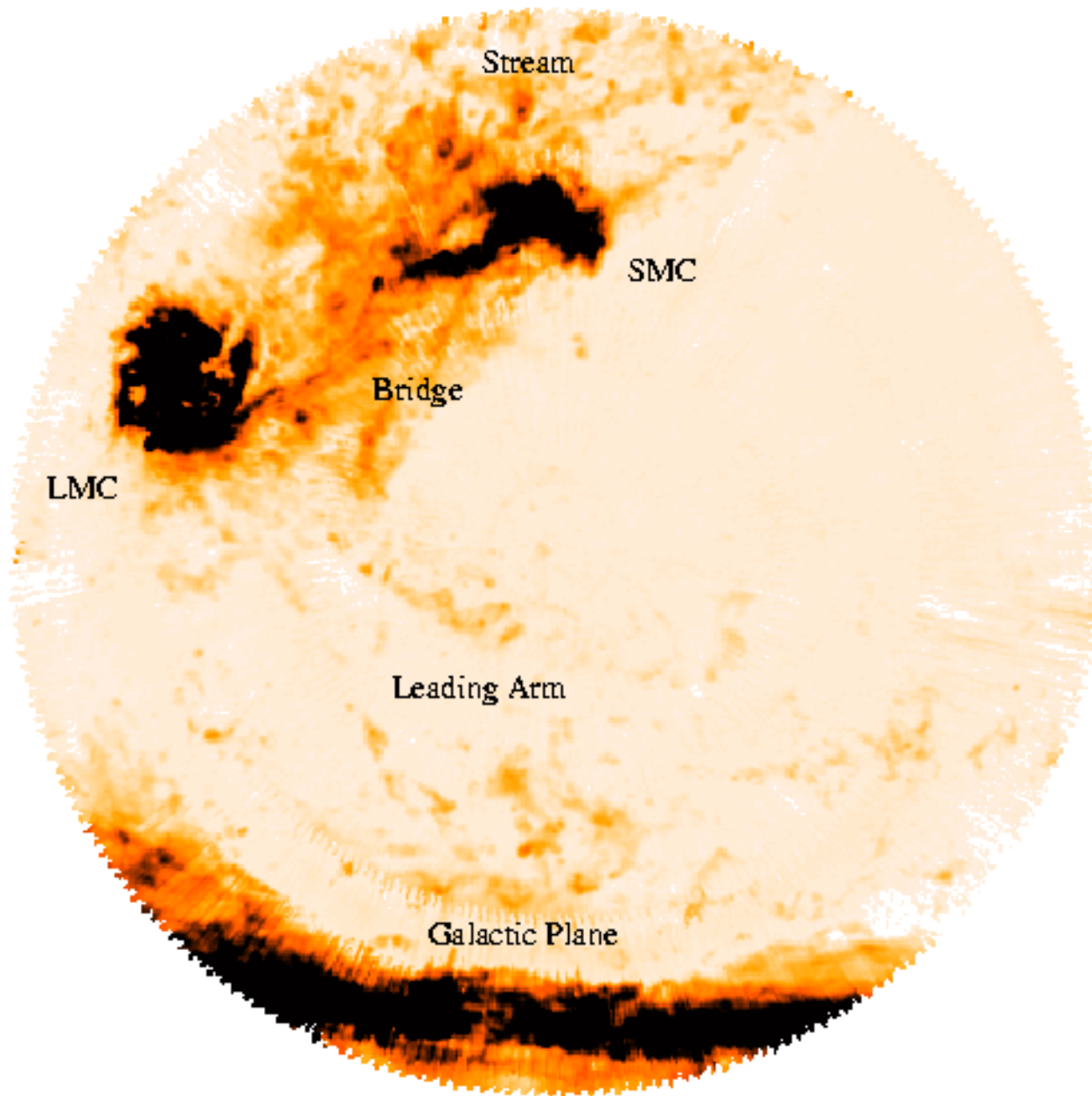
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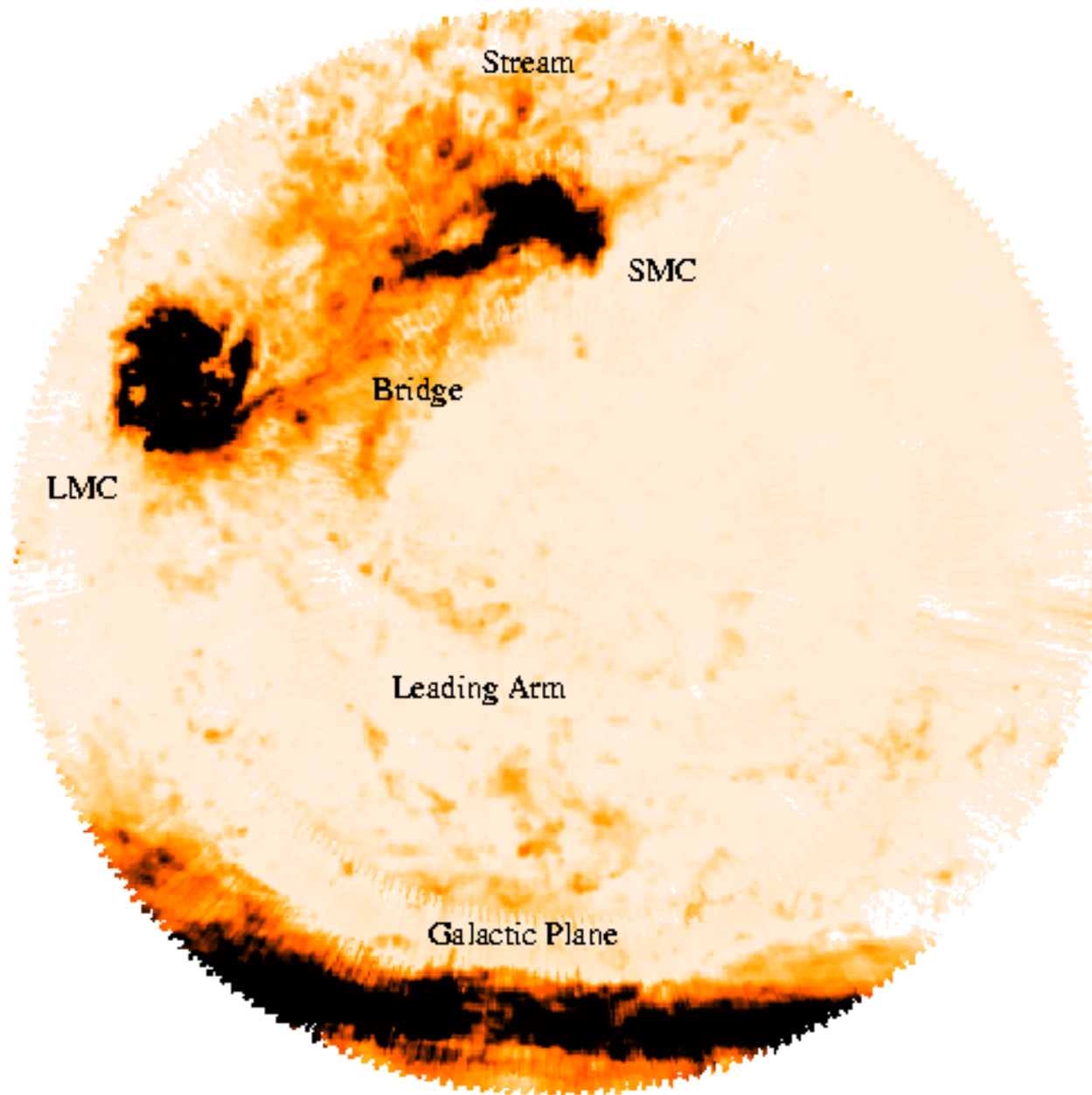
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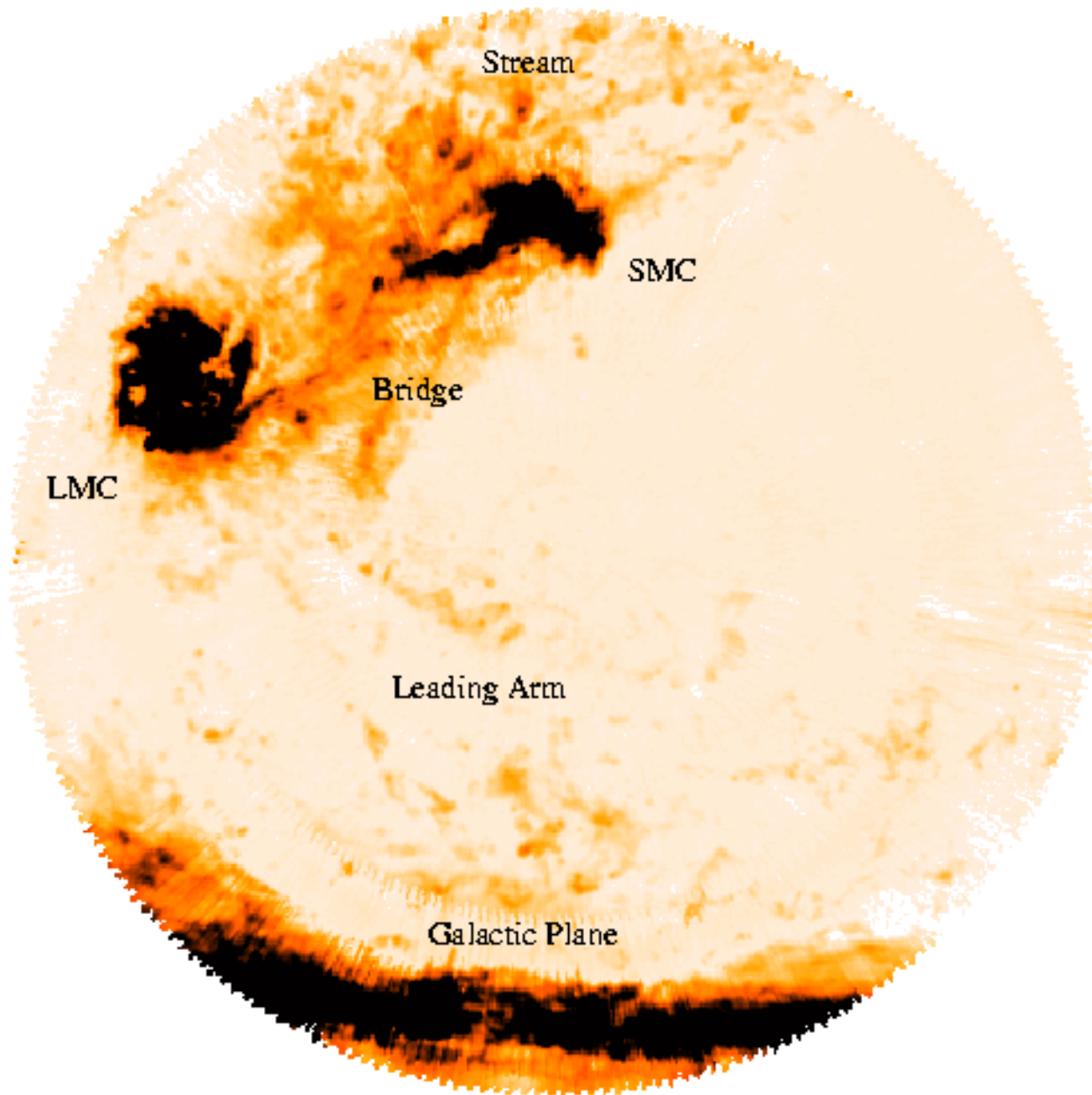


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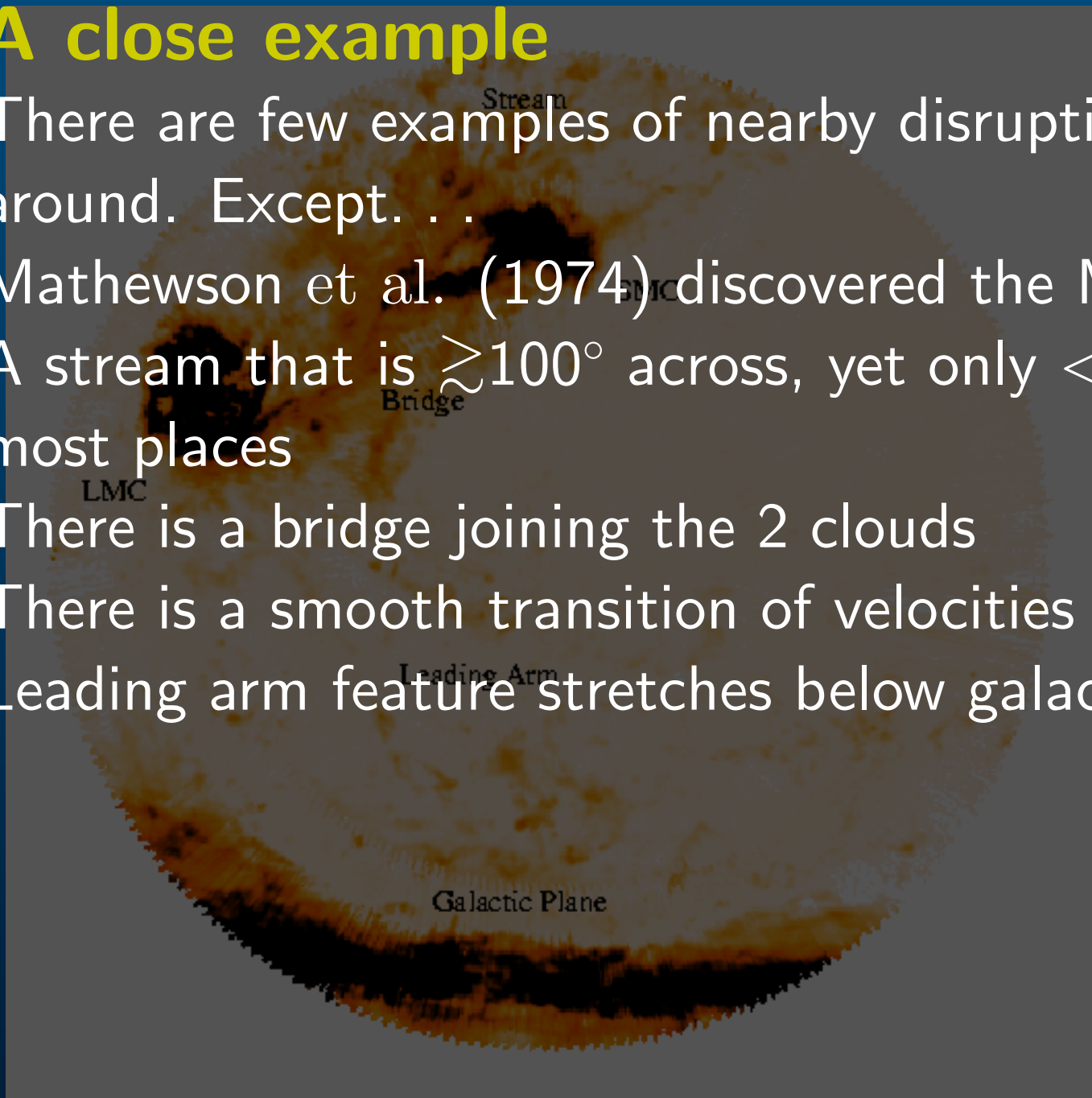
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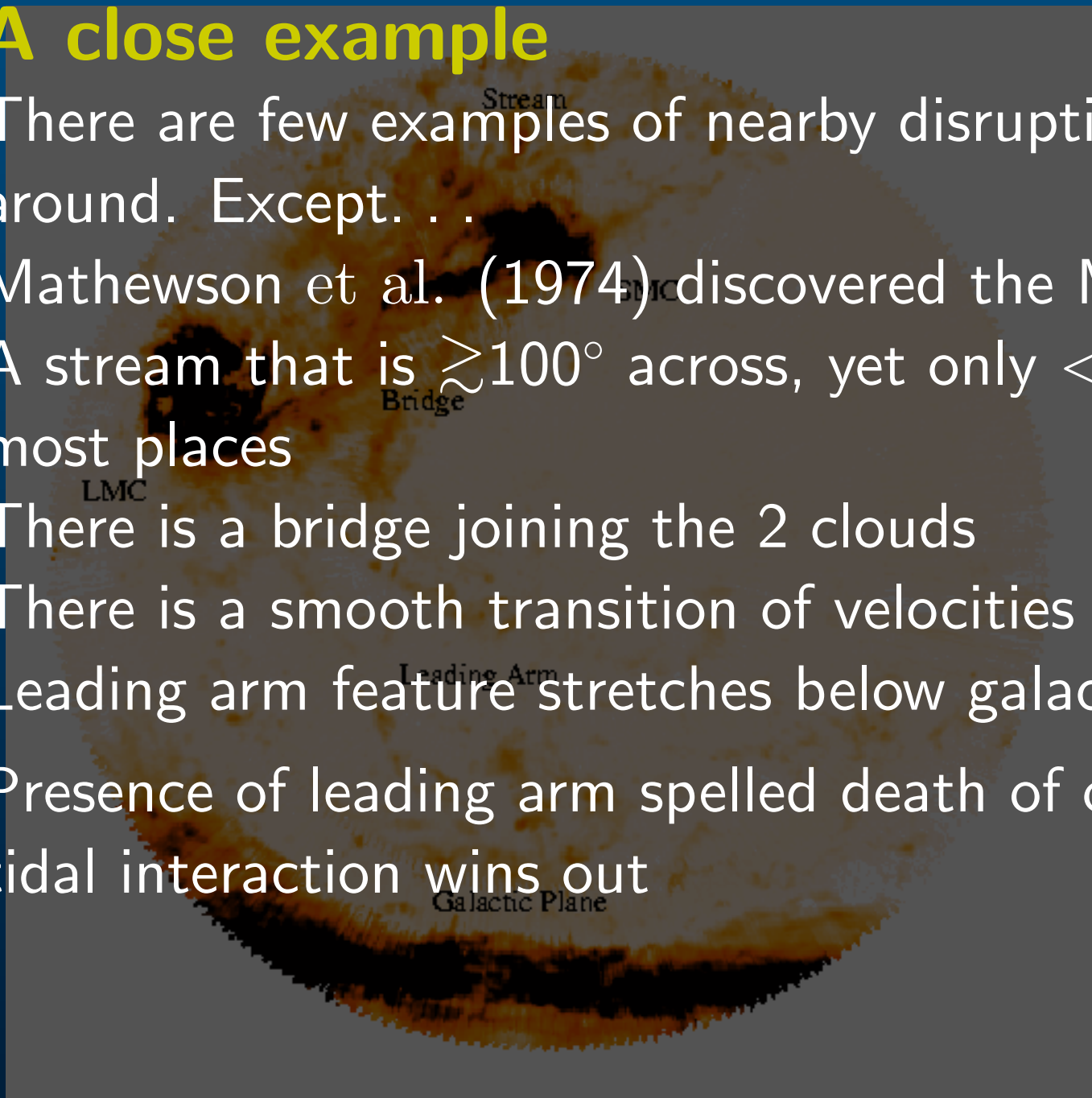
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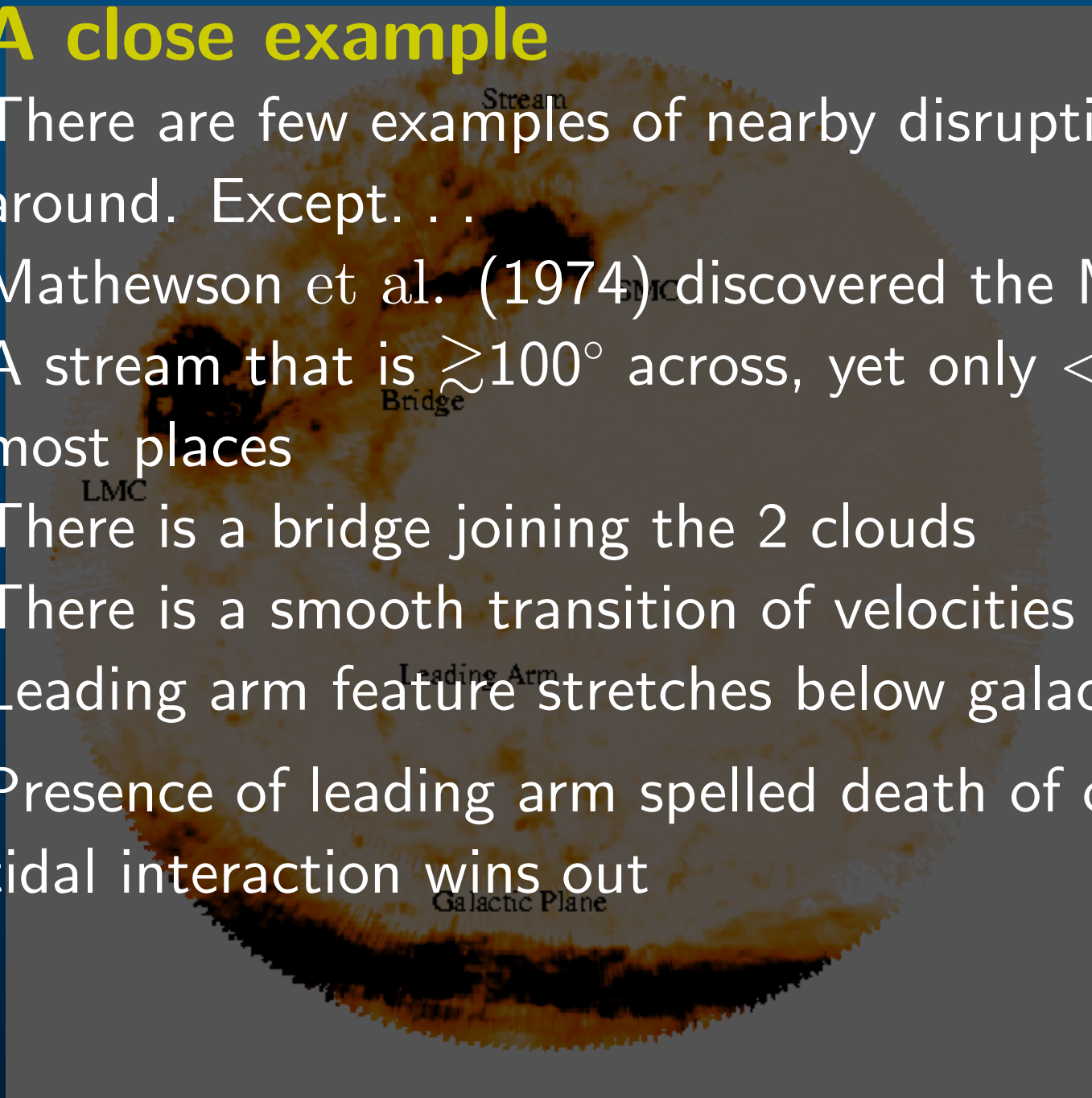
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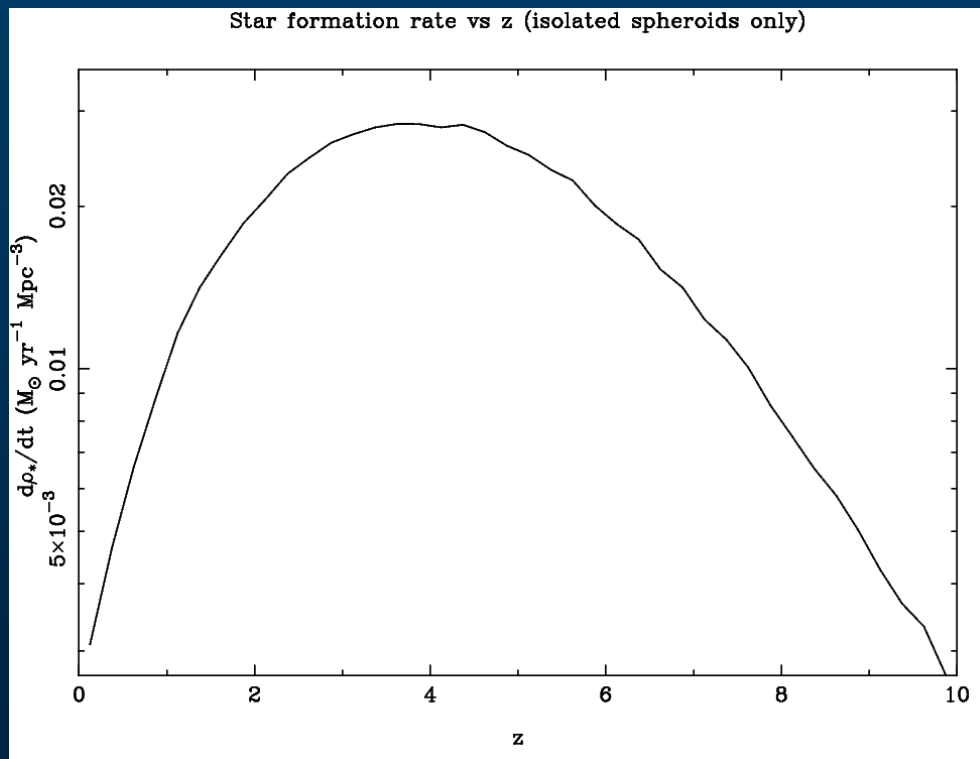
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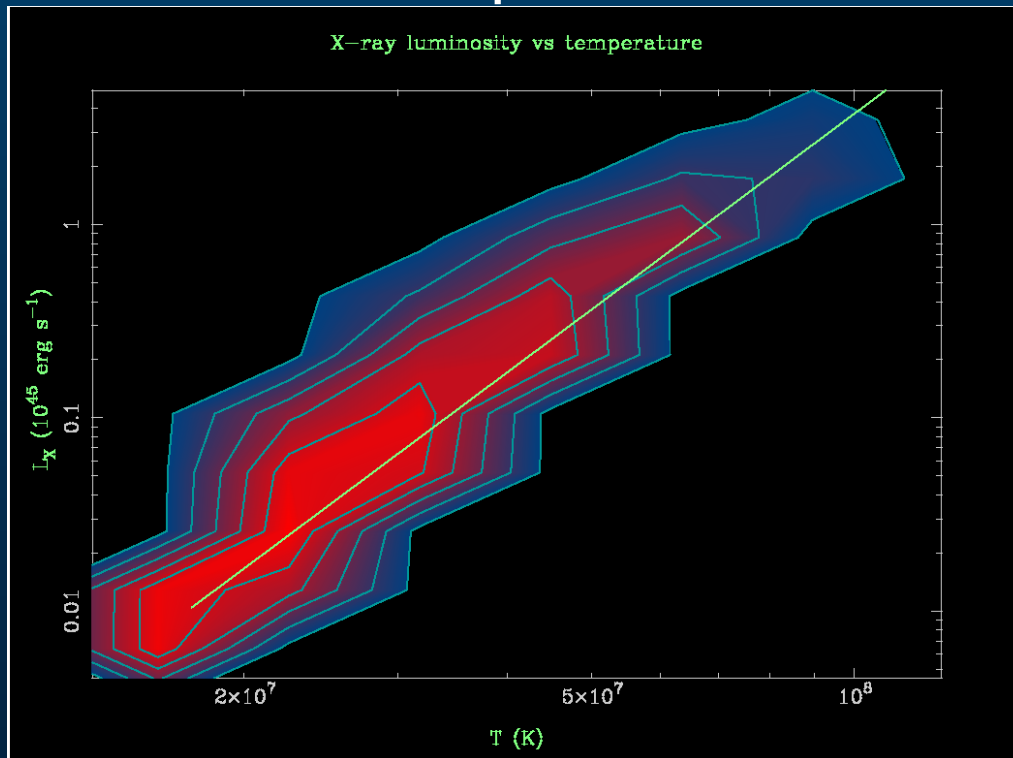
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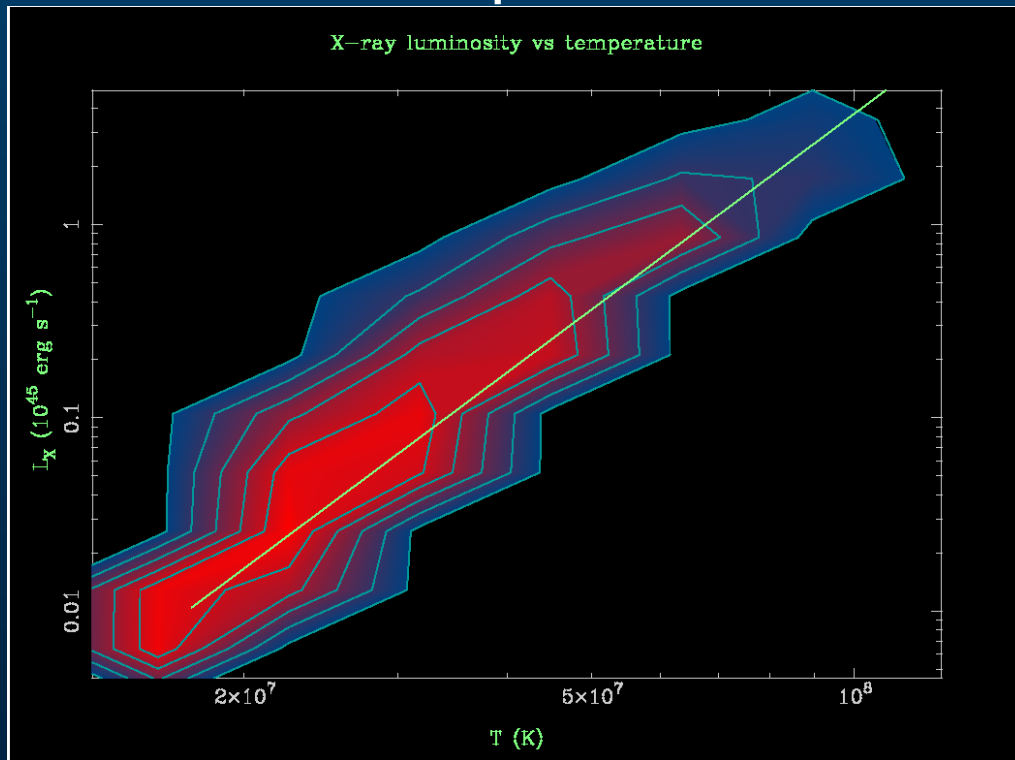


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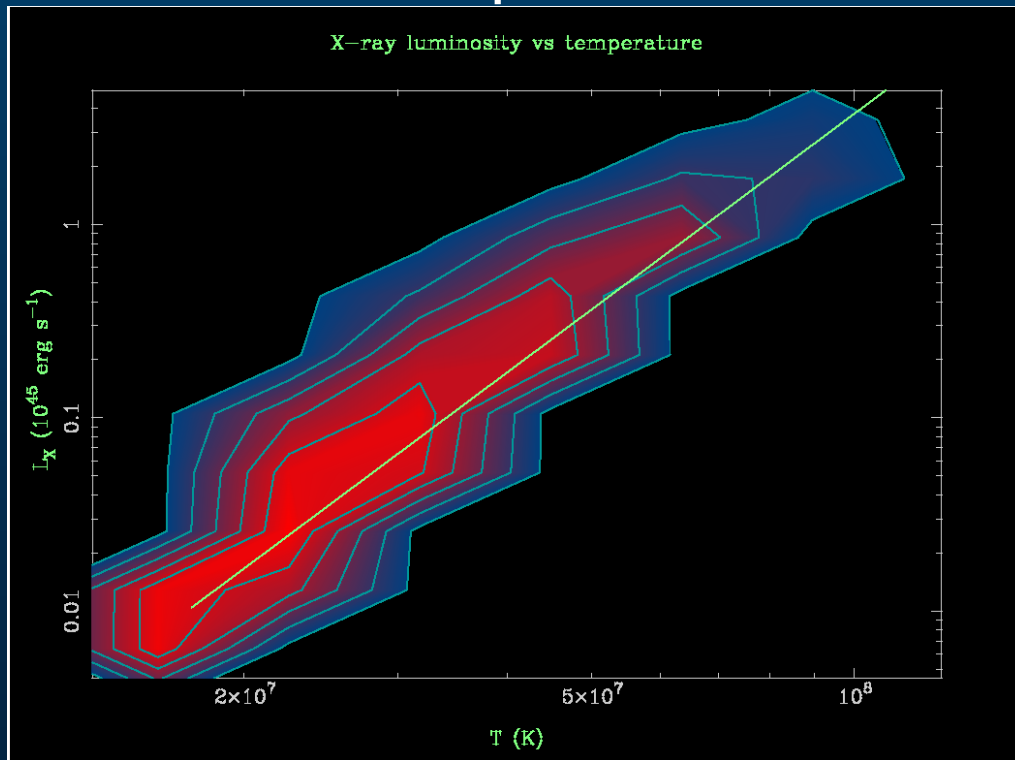
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Now for a movie produced by Sarah and Daisuke. . .



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And finally, once all the physics is correct, the HVC problem is resolved, the ironing is done, run the simulation forward in time, so that when “they” are observing the Magellanic system 2 Gyr later, they can verify our calculations.