

# THE MASTER's HAND:

Can image analysis  
distinguish originals from copies?

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Green Lecture, IPAM, UCLA



How it all started:

Rick Johnson (Cornell):  
sabbatical in France  
visits Van Gogh Museum  
conservator department  
use of chemical analysis,  
X-rays, infrared, ..  
why no image analysis?



This led to the first IP4AI workshop

IP4AI: Image Processing for  
Art Investigation

Since then: 5 workshops

Typically held at a museum

(van Gogh Museum, MoMA,  
Belgian Academy, NCMA)

Mix of “art people” & “data people”



First IP4AI workshops:  
focused tasks.

Example: distinguish work from  
different periods in artist's life  
or: characterize “style”





(movie with swirling paintings)

# Analysis method: study images at different **scales**

In particular:

- determine image content at different scales
- which information “lives” at different scales?
- find local hierarchical relationships governing information at these scales

# Determine information at different scales



# Determine information at different scales



blur



# Determine information at different scales



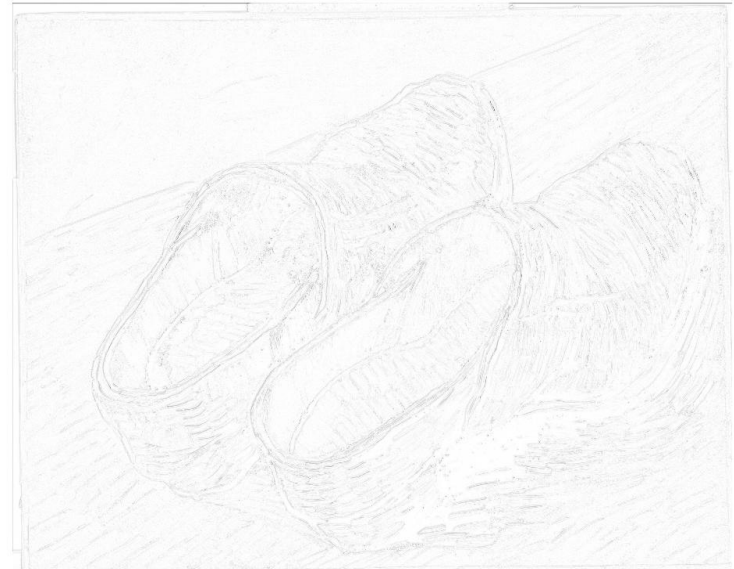
blur



and find the  
difference



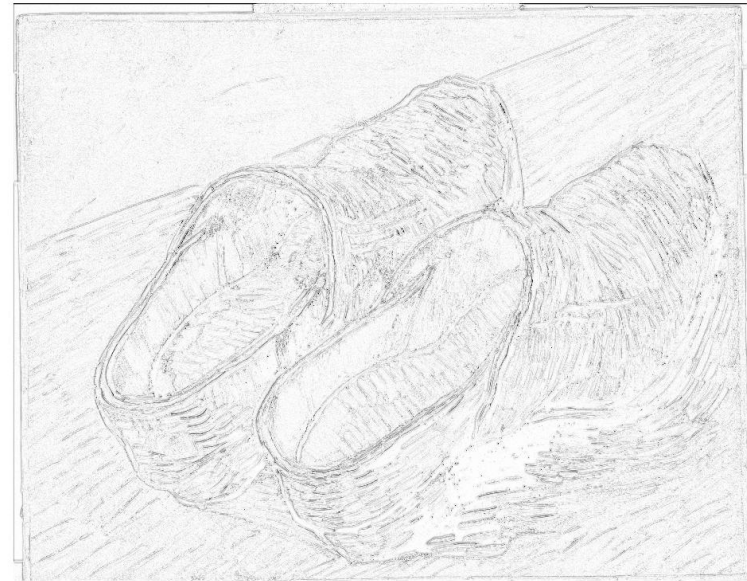
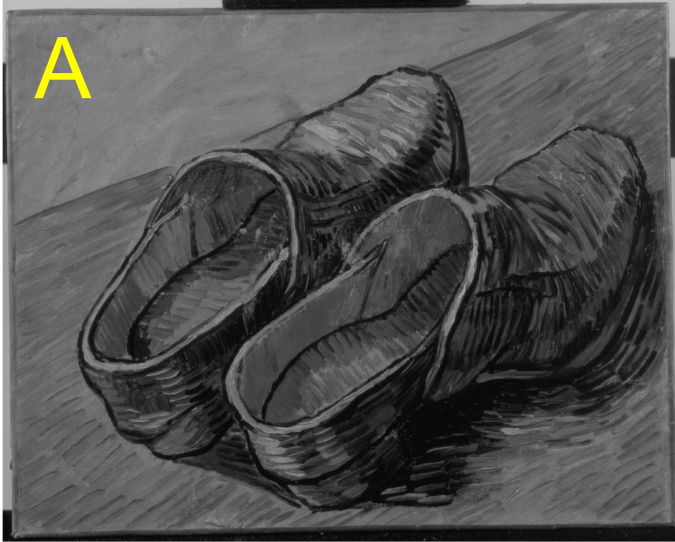
# Determine information at different Scales



Difference = A - B



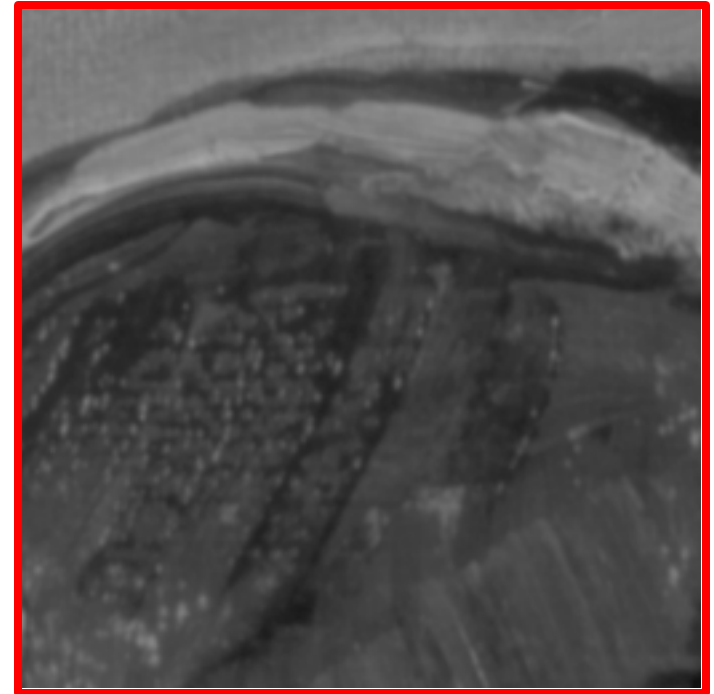
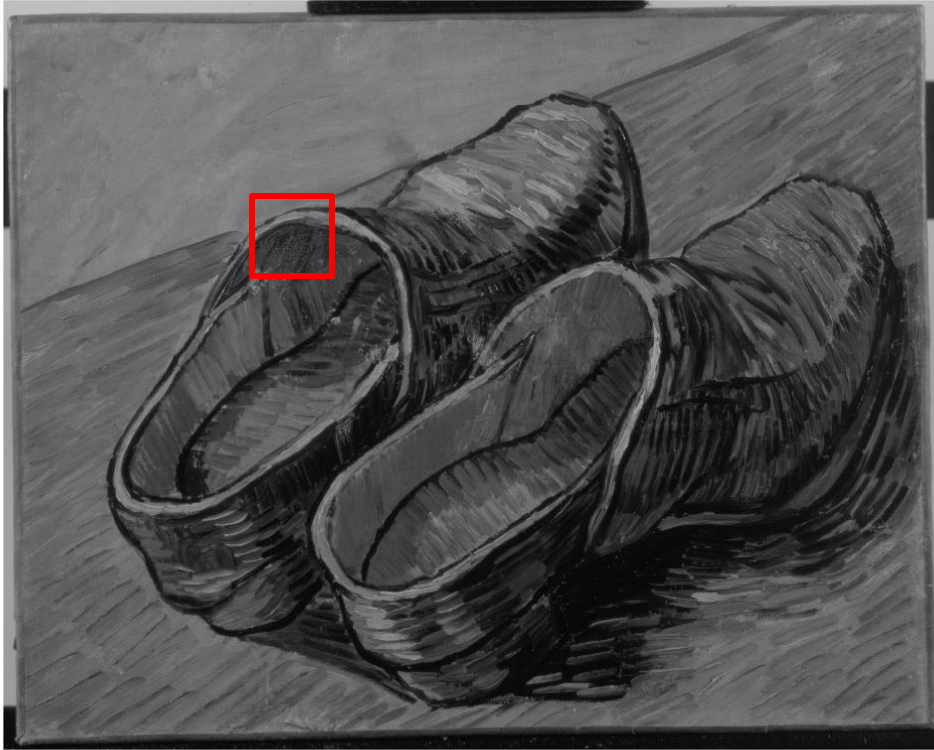
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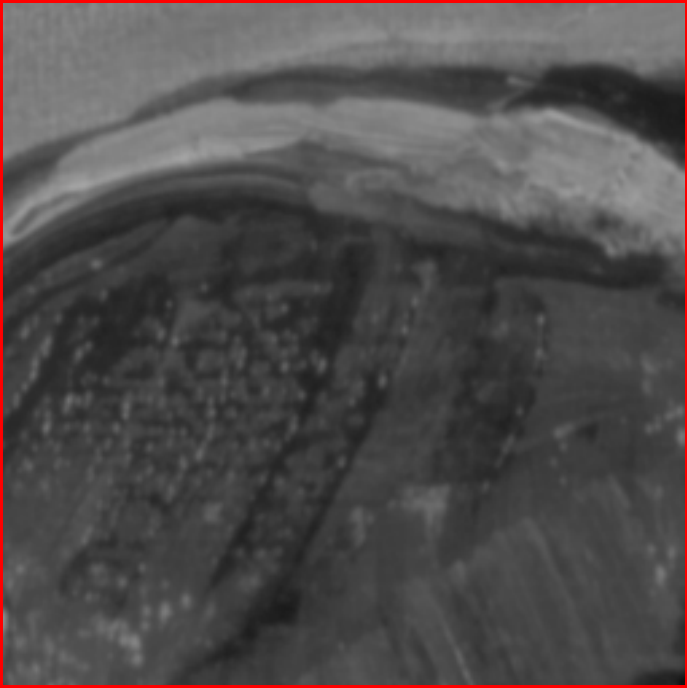
Difference = A - B

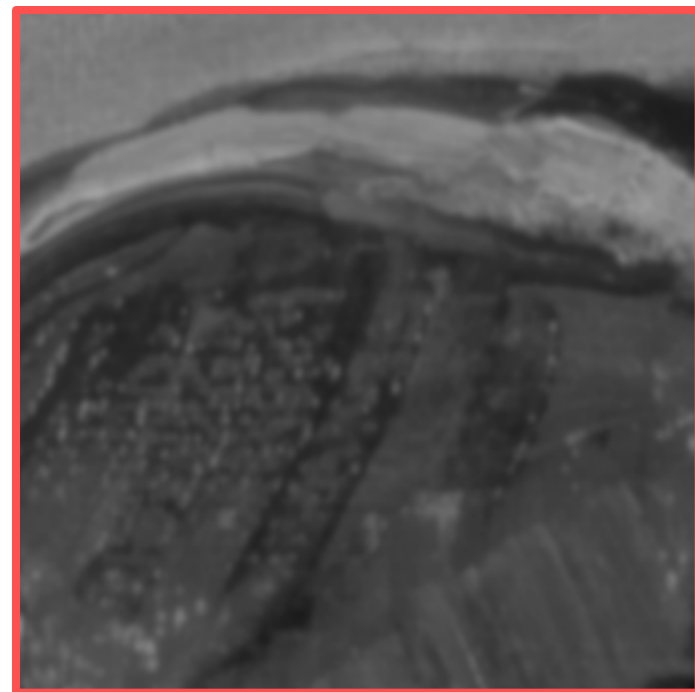
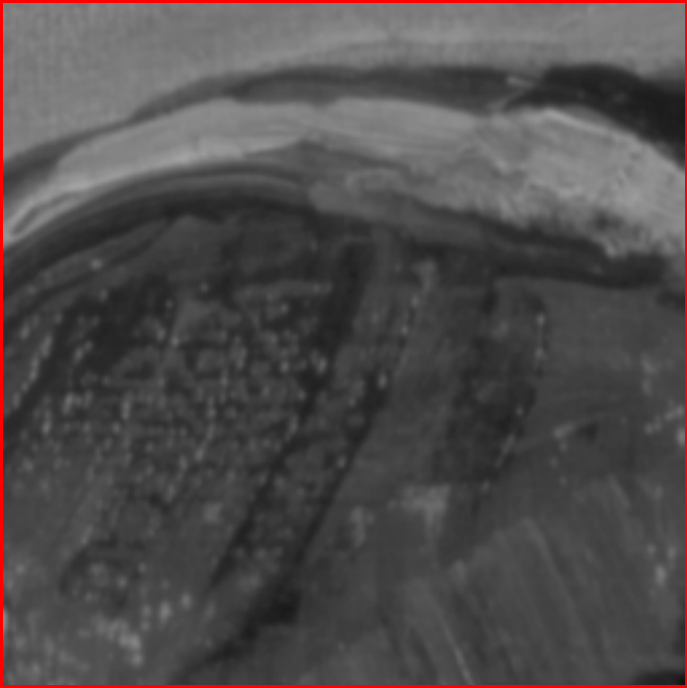


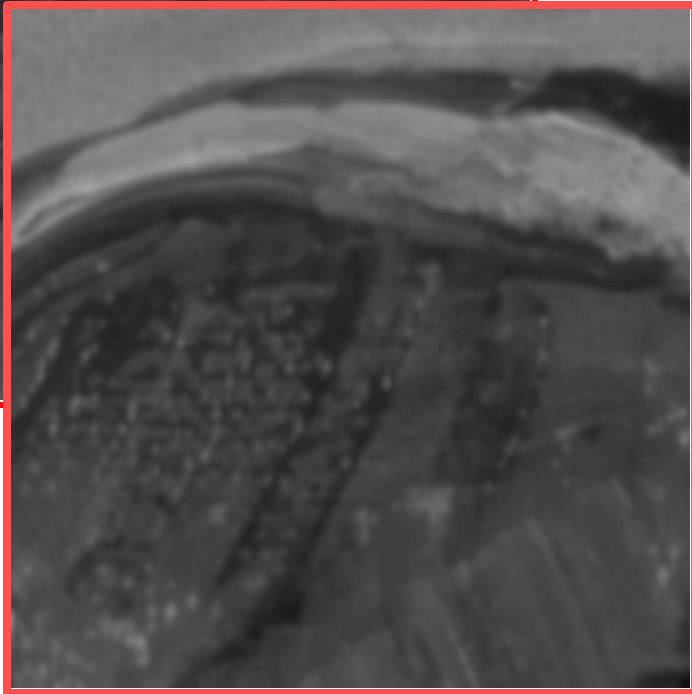
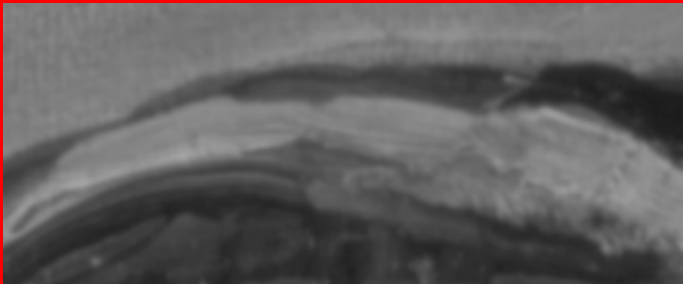
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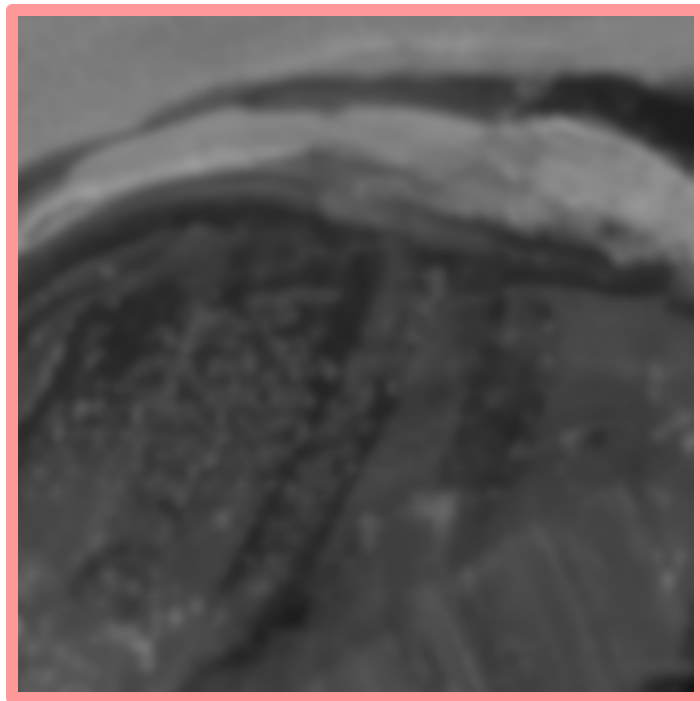
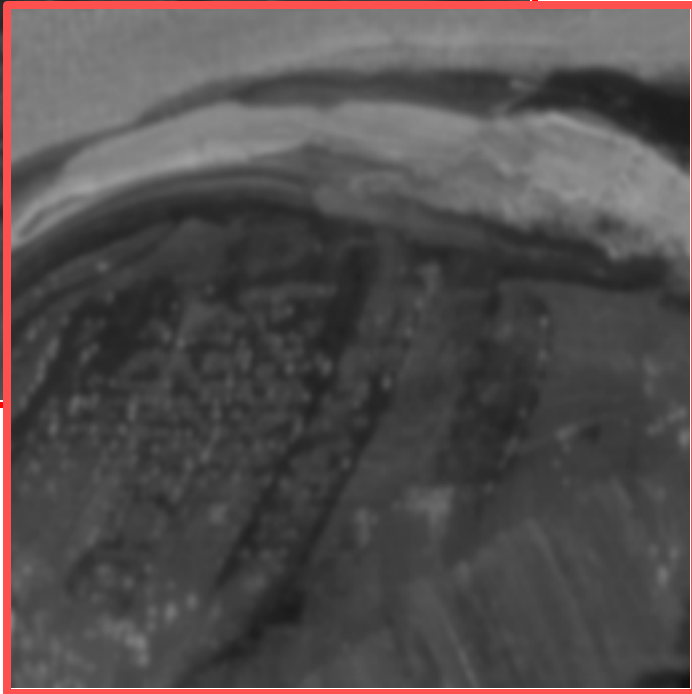
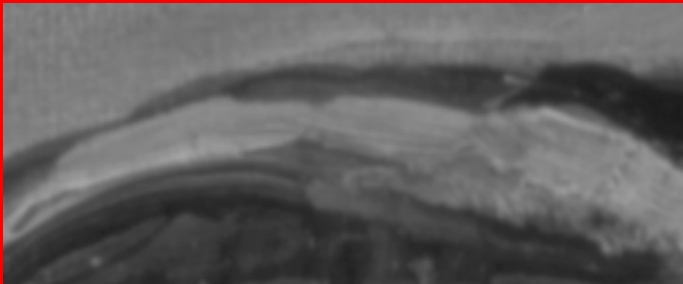


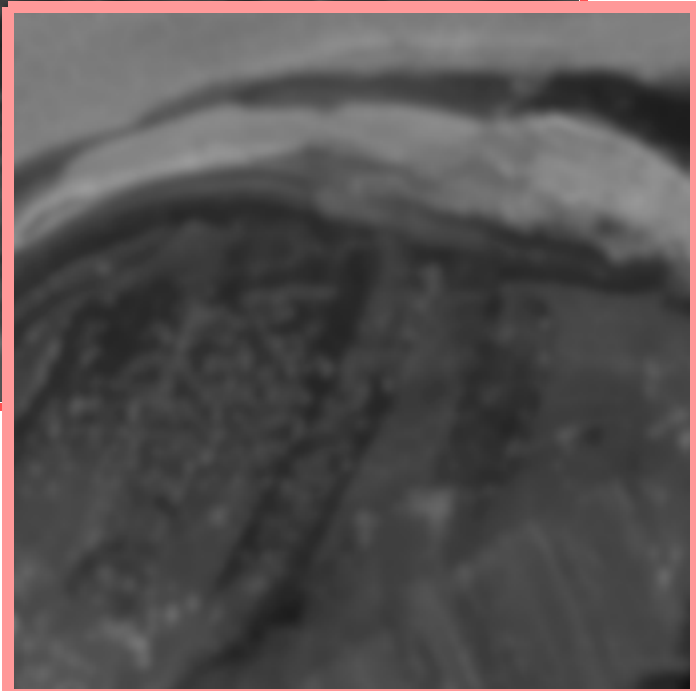
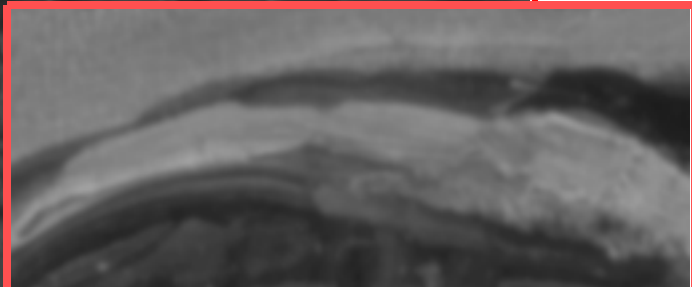
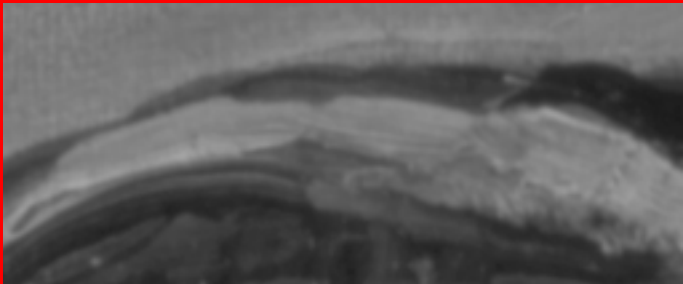


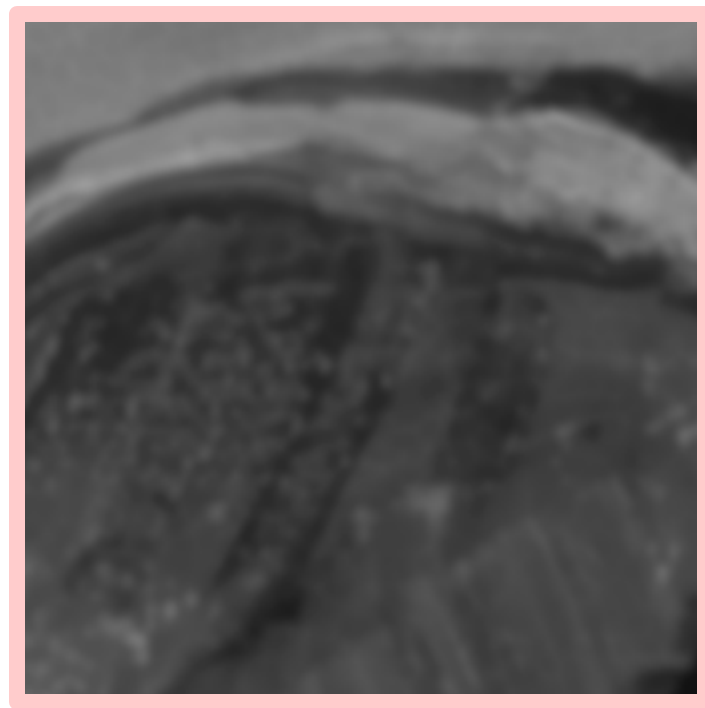
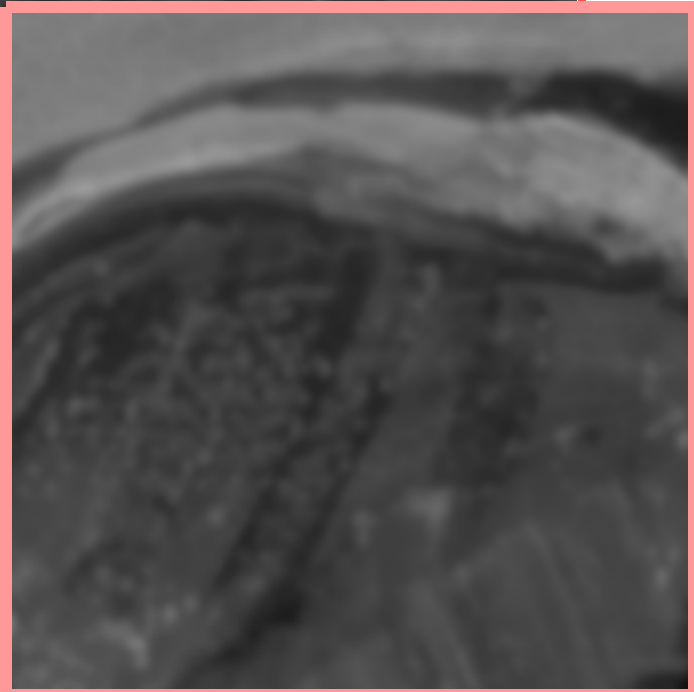
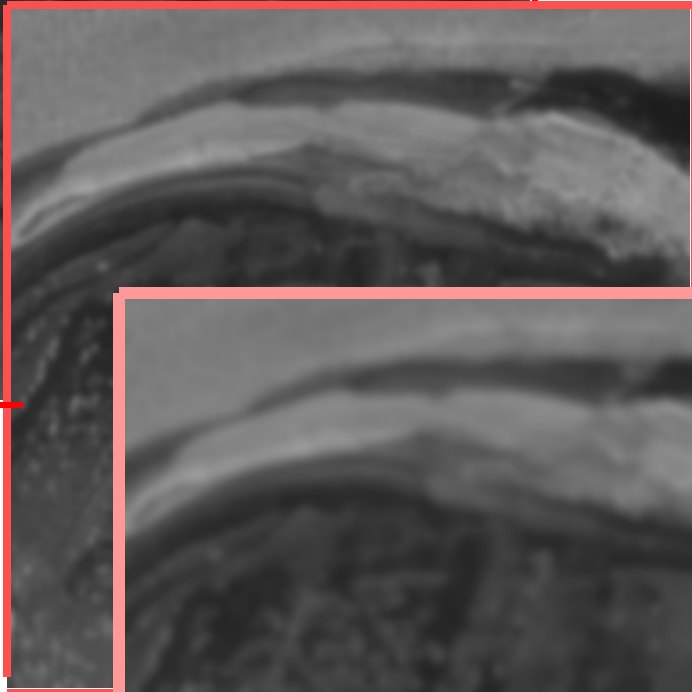
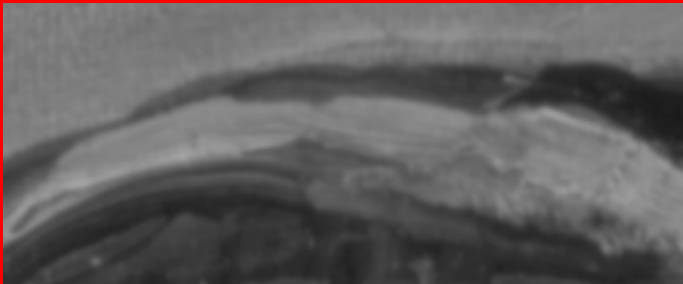


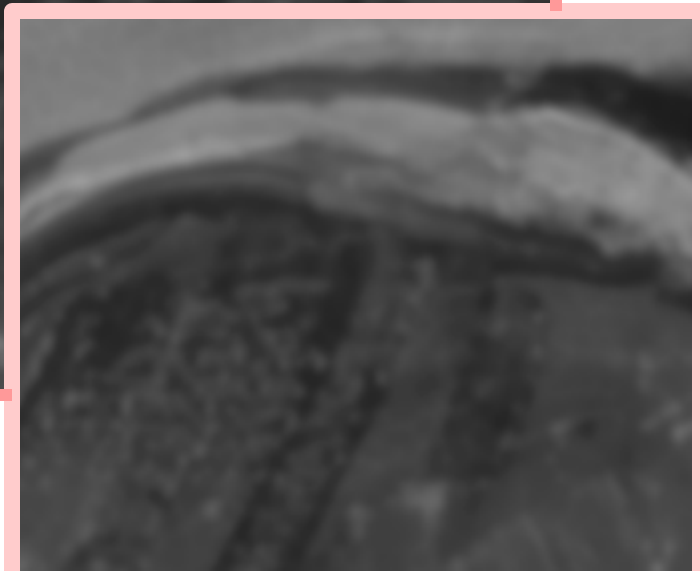
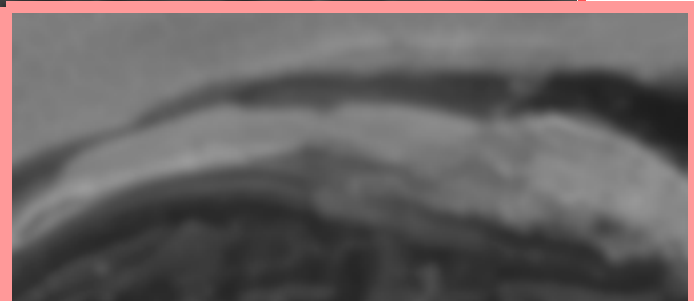
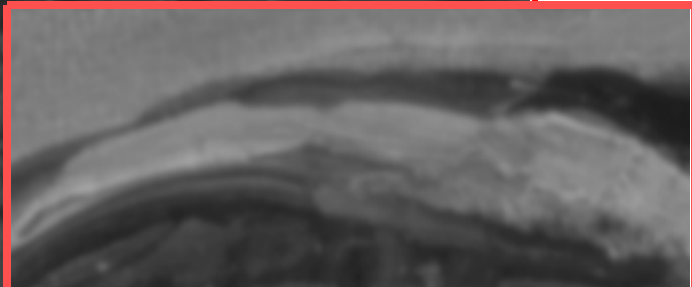
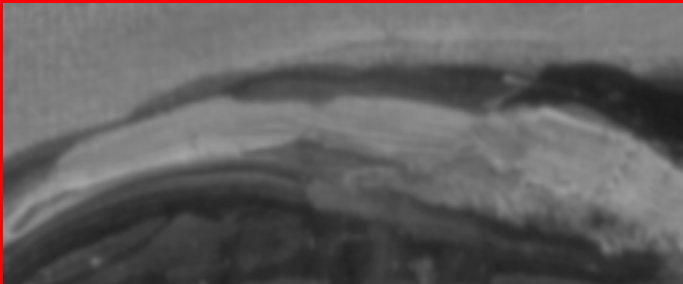


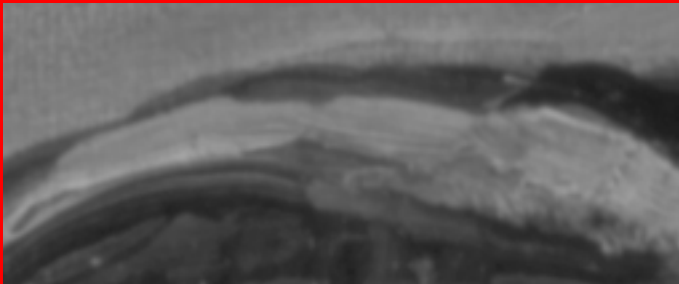






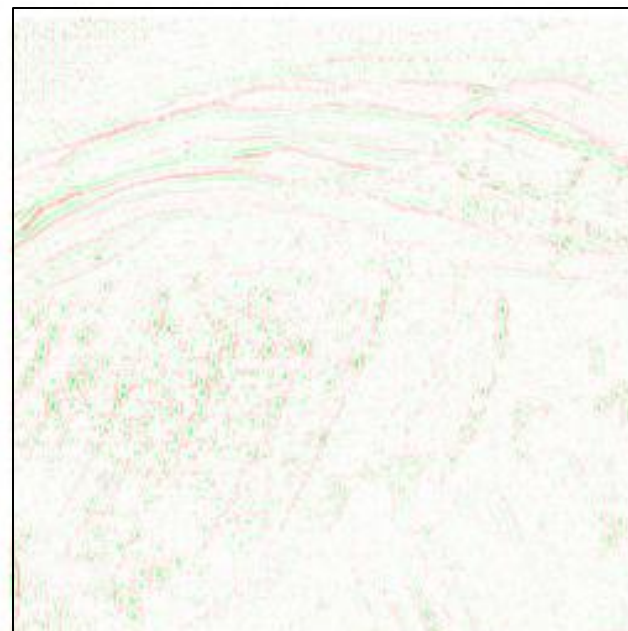
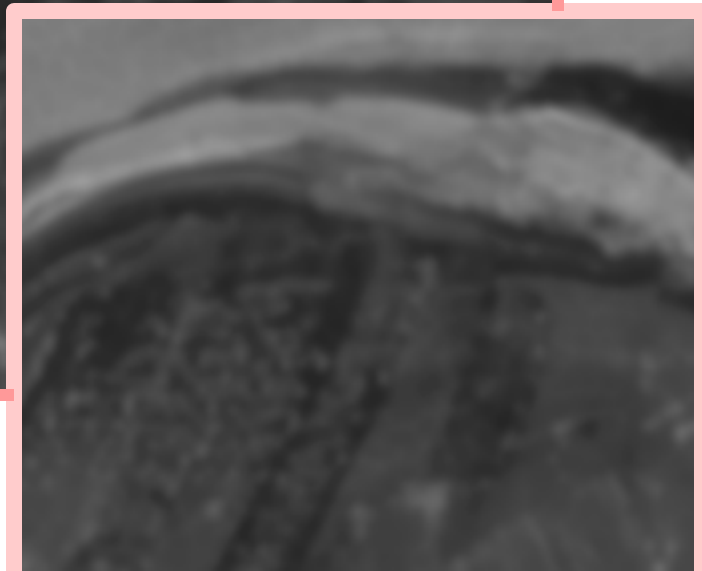
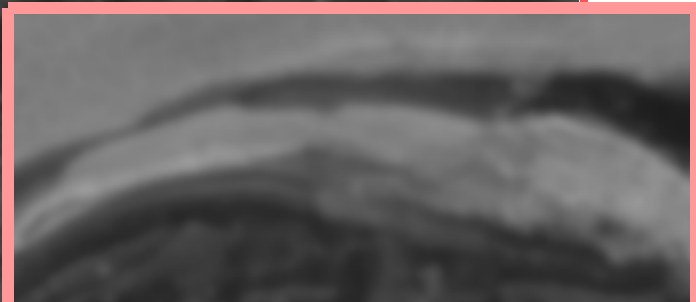




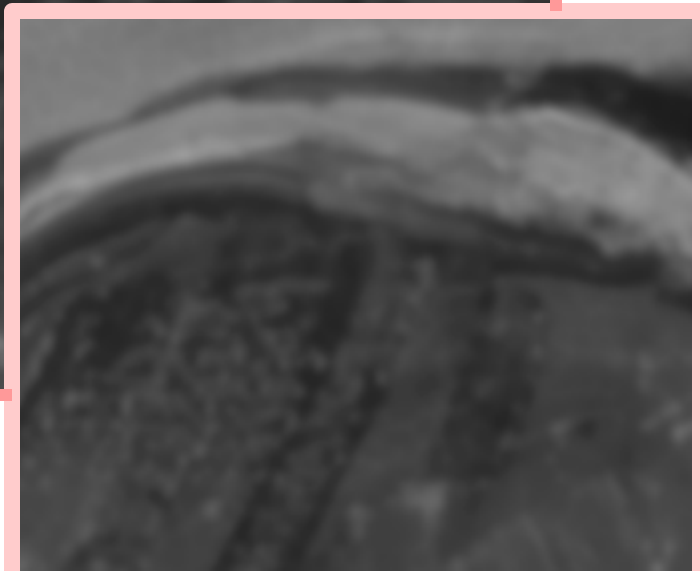
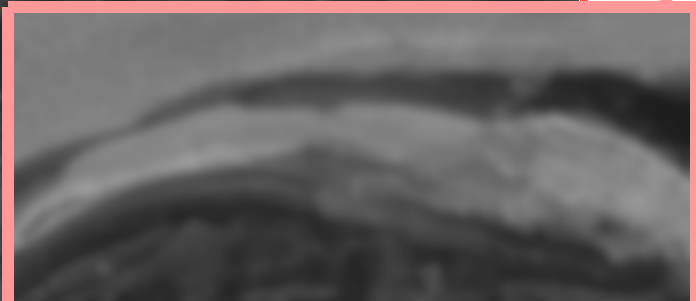
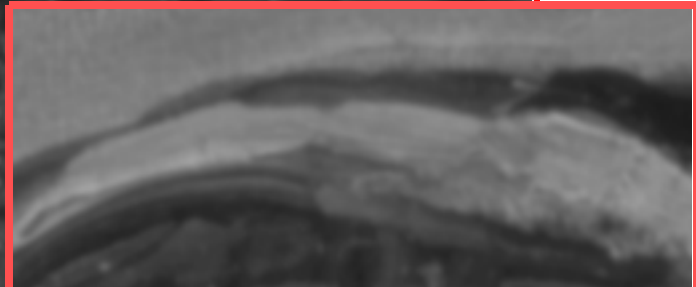
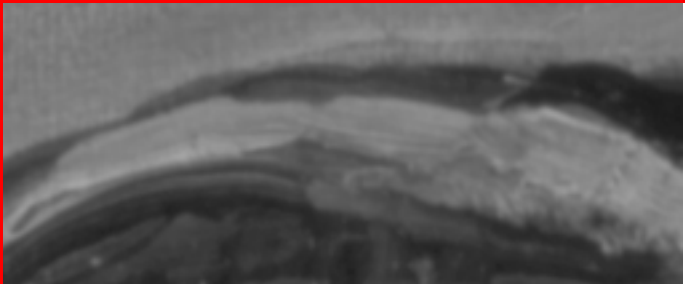


A

-B

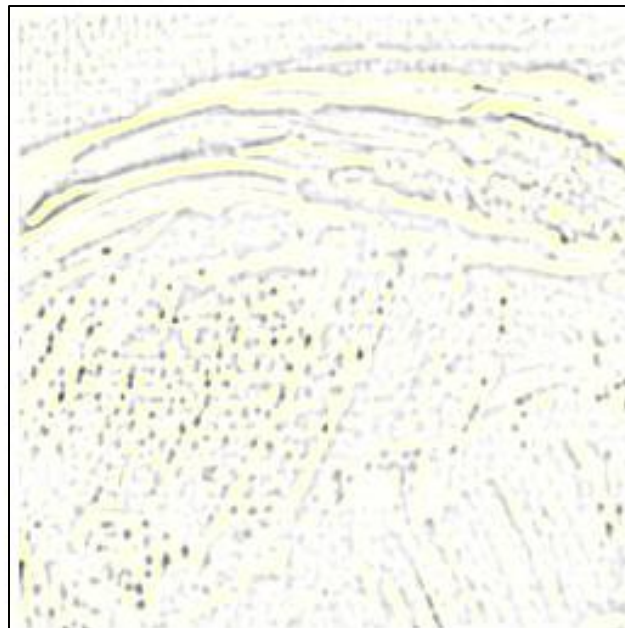


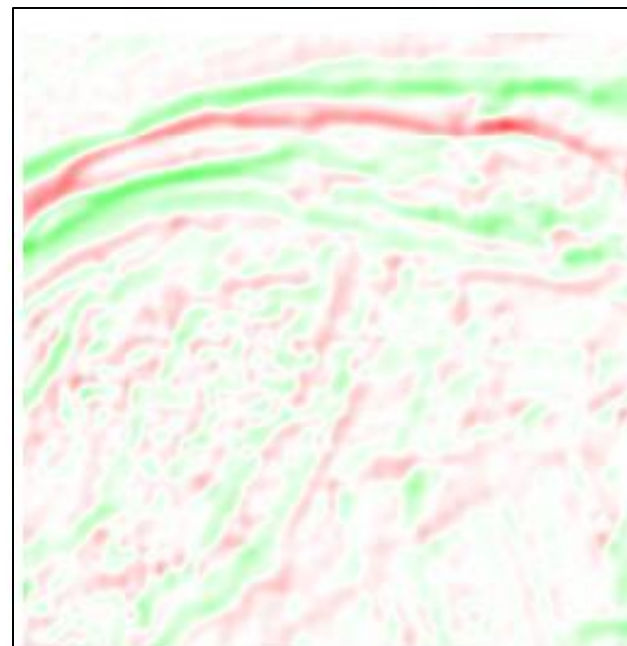
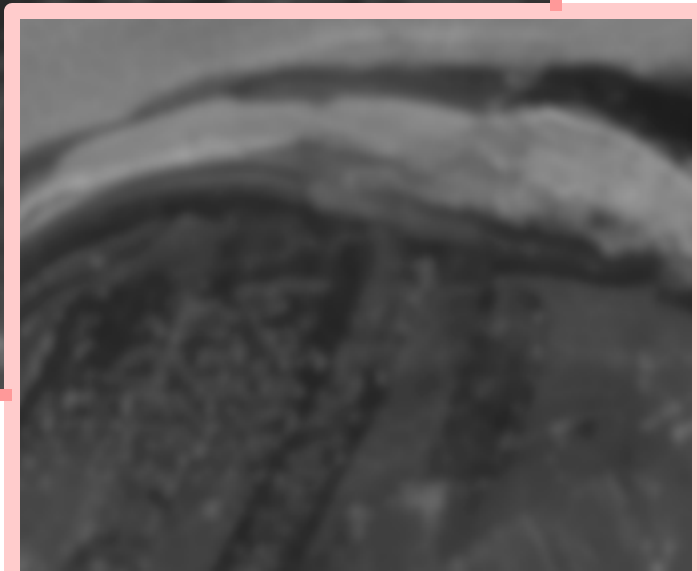
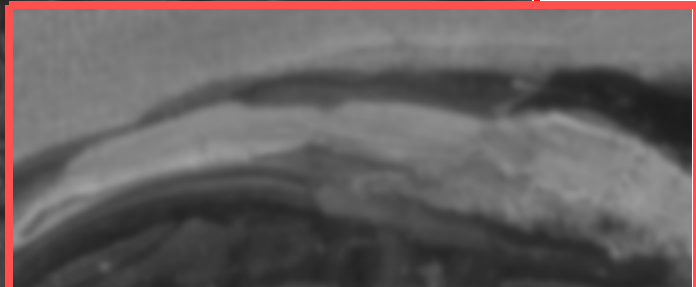
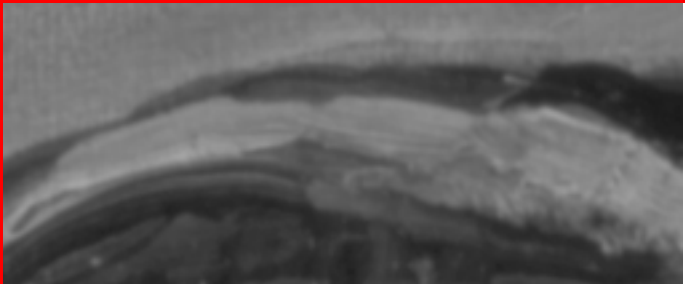




B

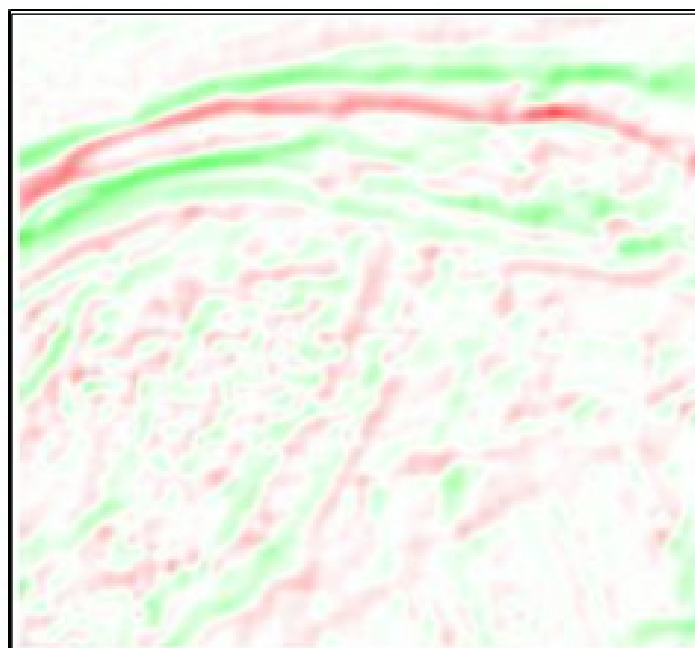
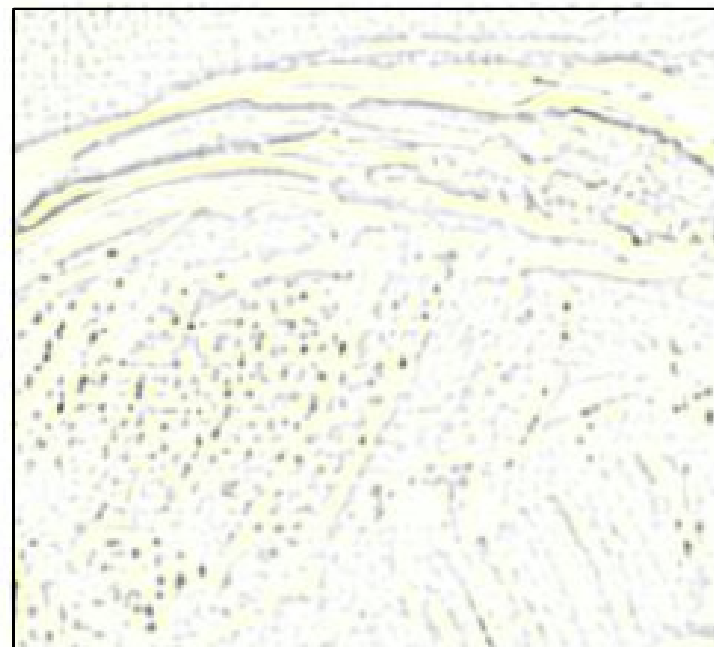
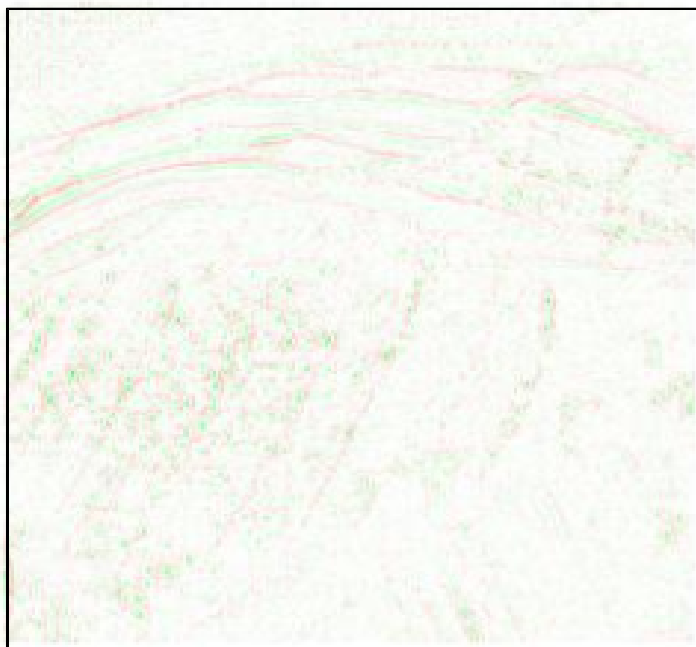
-C

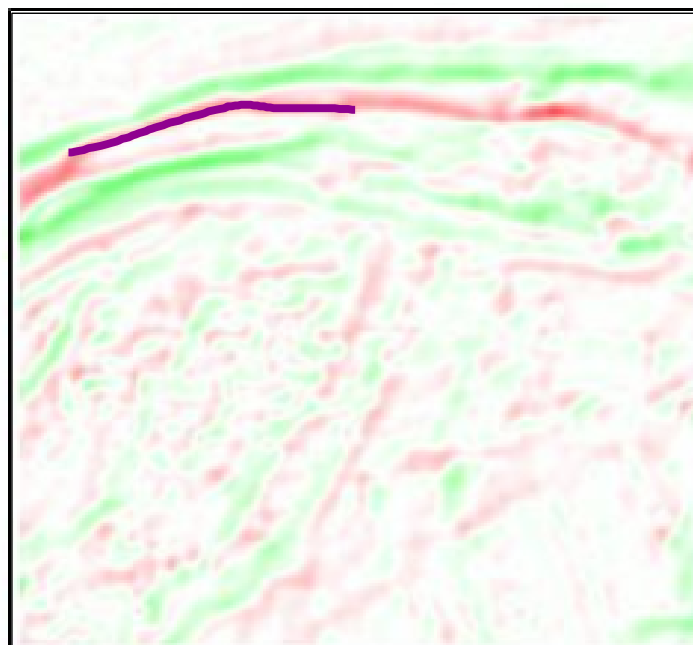
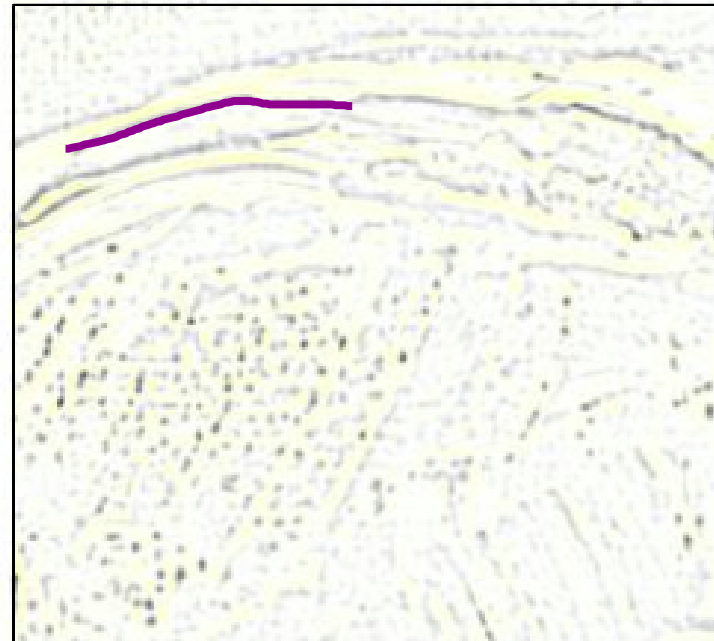
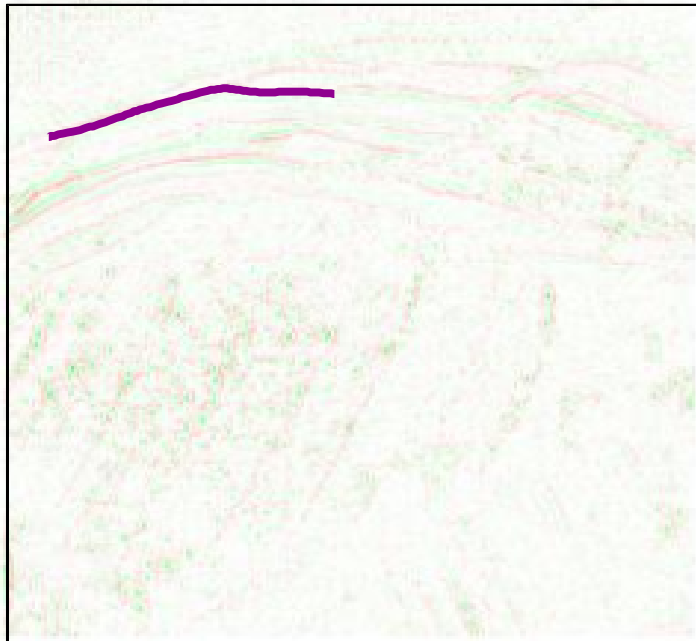


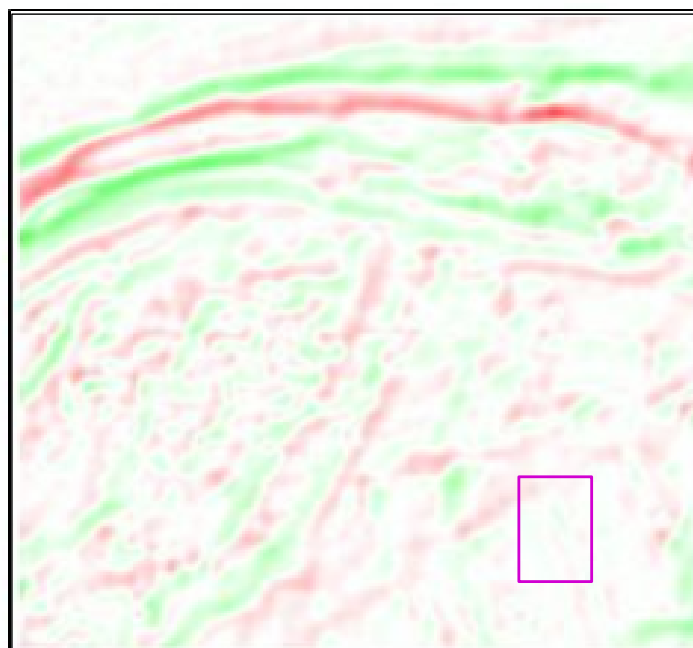
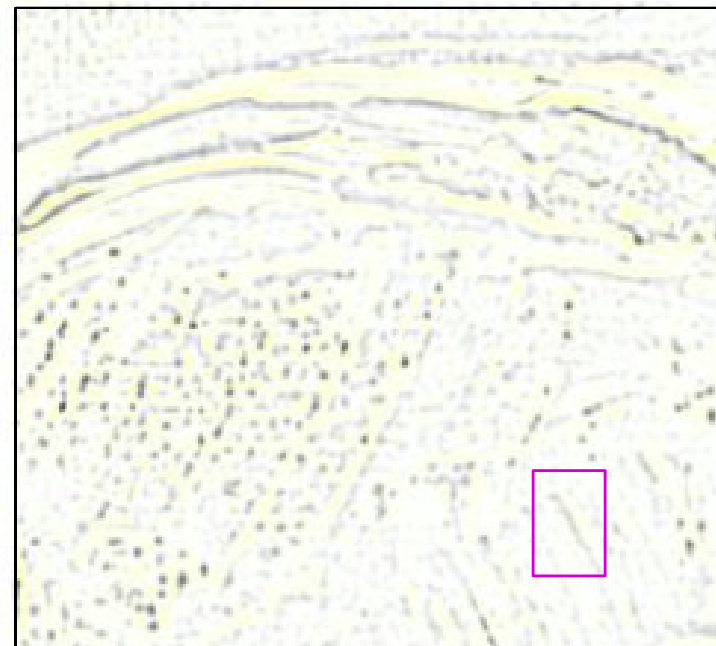


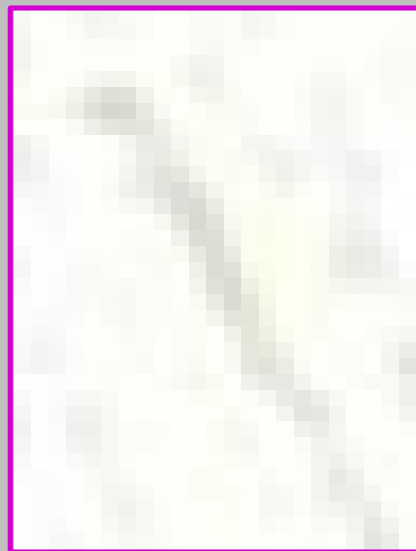
C

-D









For each painting patch: 140 features

Compare paintings:

ensemble of feature vectors for  
patches within a painting

collection of these ensembles, one  
for each painting

leads to dissimilarity (distance)  
between paintings



NOVA: had idea of making a small program.

[www.pbs.org/wgbh/nova/teach/art-authentication.html](http://www.pbs.org/wgbh/nova/teach/art-authentication.html)



# IP4AI1: The NOVA Challenge



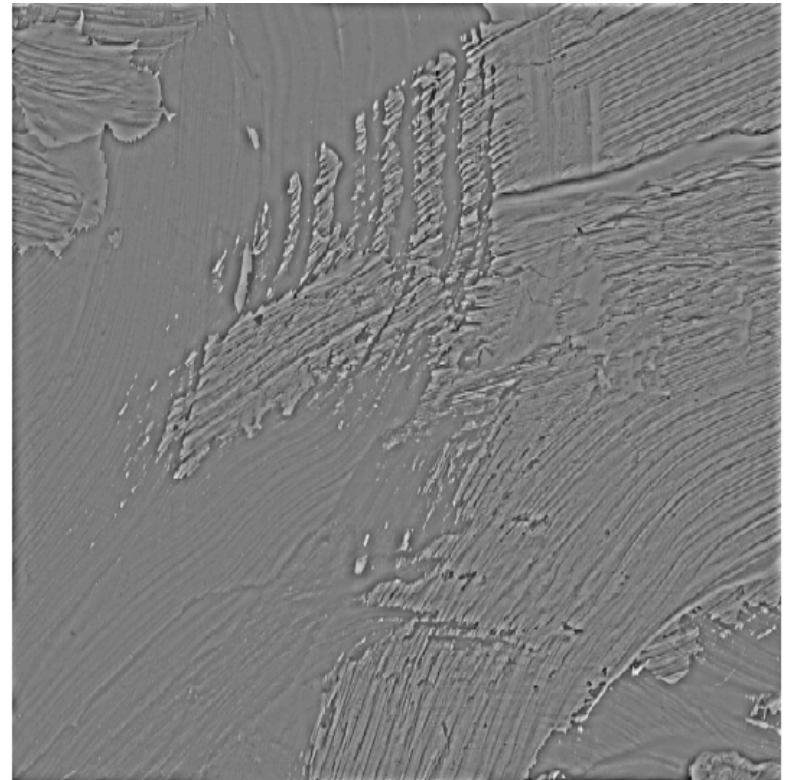
# The NOVA Challenge







# Very Fine Scale Detail: fluency of brush stroke





## IP4AI2:

# Work on Expanded Dataset

To test our capability to detect copies, the dataset for IP4AI2 (2008) included a contemporary copy of a VG painting, as well as datasets for more VG paintings than before.



**IP4AI2:**

## **Work on Expanded Dataset**

We looked at fine scale detail in the 21 newly added paintings to the dataset.



## IP4AI2:

# Work on Expanded Dataset

We looked at fine scale detail in the 21 newly added paintings to the dataset.

Our classifier considers **ALL** of the newly added paintings as “copies” or “fakes”



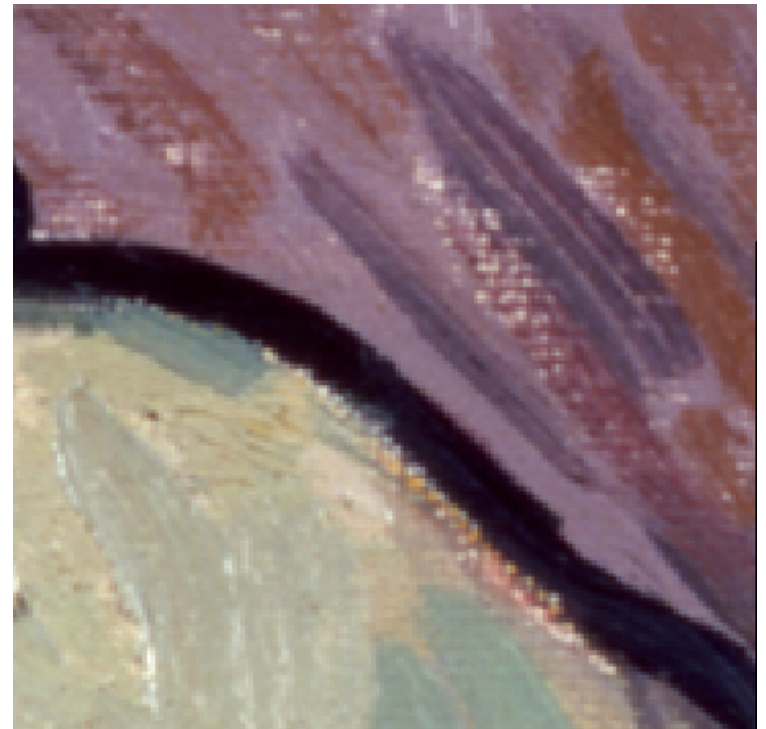
# Sharpness

Eric Postma recently purchased a new slide scanner, on which the new images were scanned.

New images are crisper than our old ones.



Section of Previously Scanned  
F338



Section of Newly Scanned S506



# Measuring Blur

We measured blur **quantitatively** in previous sets of paintings examined. For the NOVA 6:



0.65



0.98



0.9



0.9



0.93



0.90

# Measuring Blur

We measured blur **quantitatively** in previous sets of paintings examined. For the NOVA 6:



0.65



0.98



0.9



0.10



0.93



0.90

Here the copy is by far the least blurry. This unfairly helped us detect it ...

# A Second Validation Test

We asked Charlotte Caspers to paint a series of pairs of small paintings

In each pair: one original  
one copy

Different pairs painted with different brushes, paint, background, ...

# Charlotte Caspers - Reconstructions





# Charlotte Caspers - Reconstructions





# A Second Validation Test







Some of the originals and copies painted by Charlotte.



# Variety of Materials and Styles





# Advantages of this Dataset

Ground truth: we **know** which are “hesitating” copies and which are originals

Uniform digital imaging conditions:  
Blur, lighting, etc. are same;  
high-quality direct digital scan of surface

Variety of materials and styles

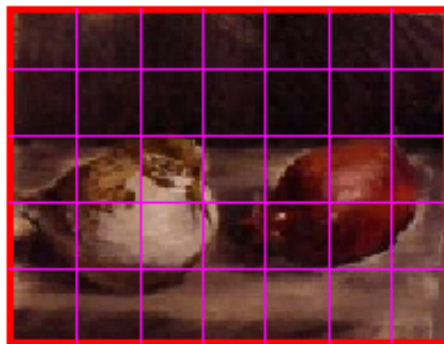


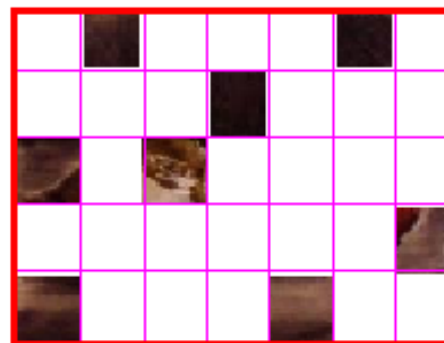
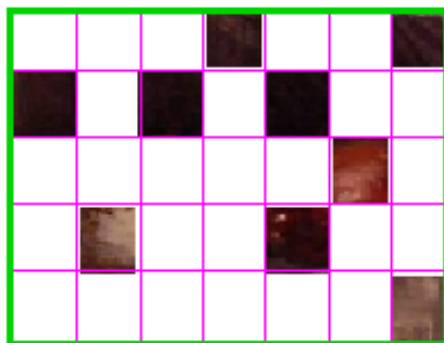
# Results

We can distinguish copies from originals in Charlotte's paintings in all cases where she used both soft and hard brushes.

What makes the difference is fairly fine detail, but some other features too.



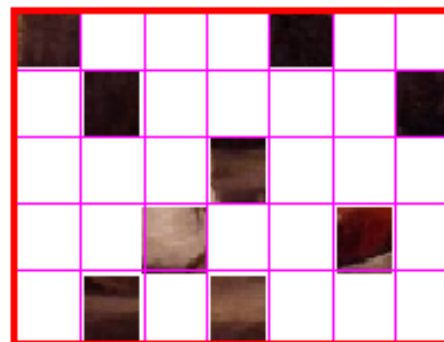




training



test



## Follow-up study

We could distinguish copies from originals in Charlotte's paintings in all cases where she used both soft and hard brushes.

Express this in more “painterly” terms? Not only prediction accuracy is important ...

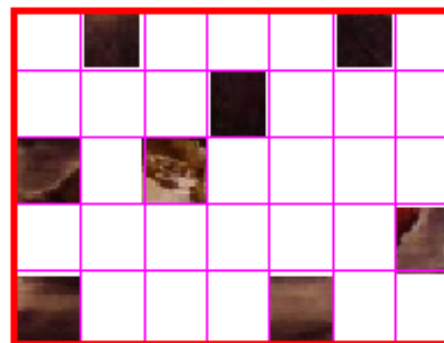
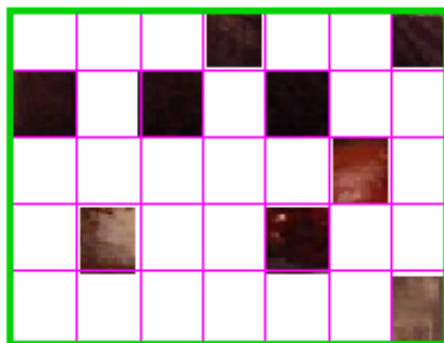
Revisited original study in 2013.



# Revisiting first study

Revisited original study in 2013.

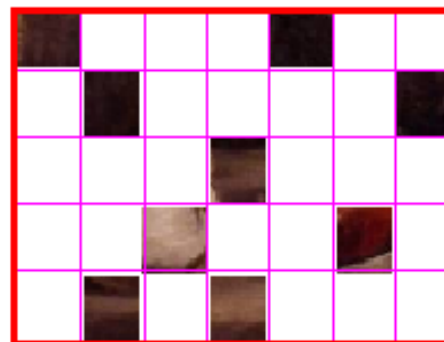
No “background” patches.



training



test







training



test



# Revisiting first study

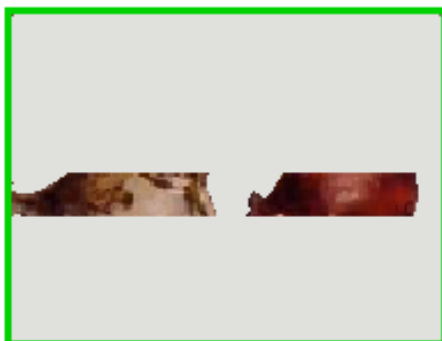
Revisited original study in 2013.

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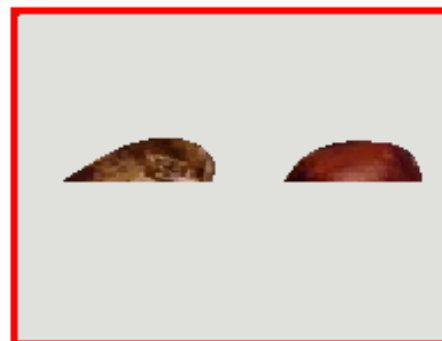
Different grouping of test/training  
patches



training



test



# Revisiting first study

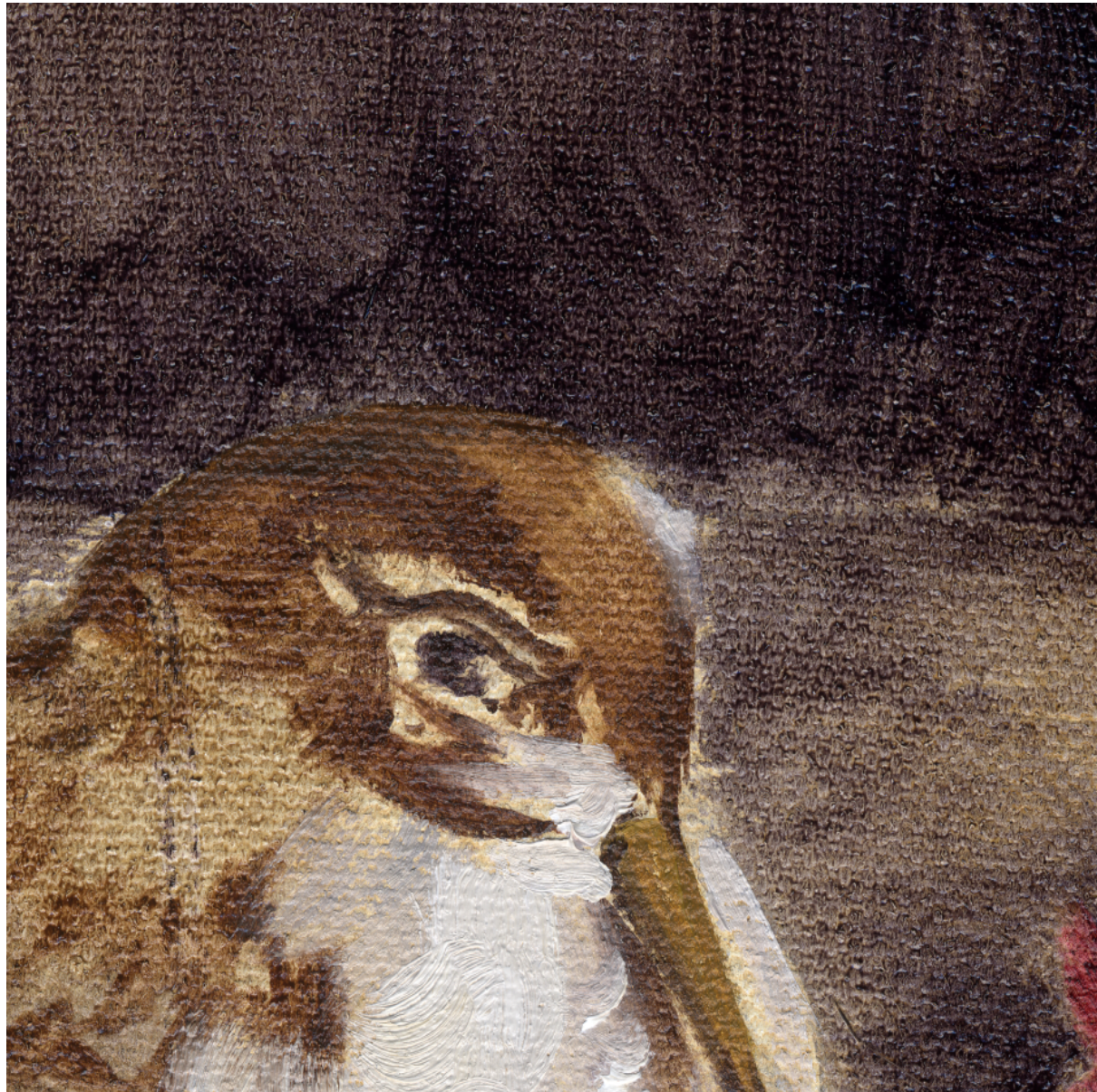
Revisited original study in 2013.

No “background” patches.

Different grouping of test/training  
patches

With same techniques as before:  
results less convincing ...





# Revisiting first study

Revisited original study in 2013.

With same techniques as before:  
results less convincing ...

but still significant!

In particular, also after  
“canvas removal”



# New data set

Again painted by Charlotte  
Caspers

on masonite: no canvas  
structure!





# New data set

Again painted by Charlotte  
Caspers

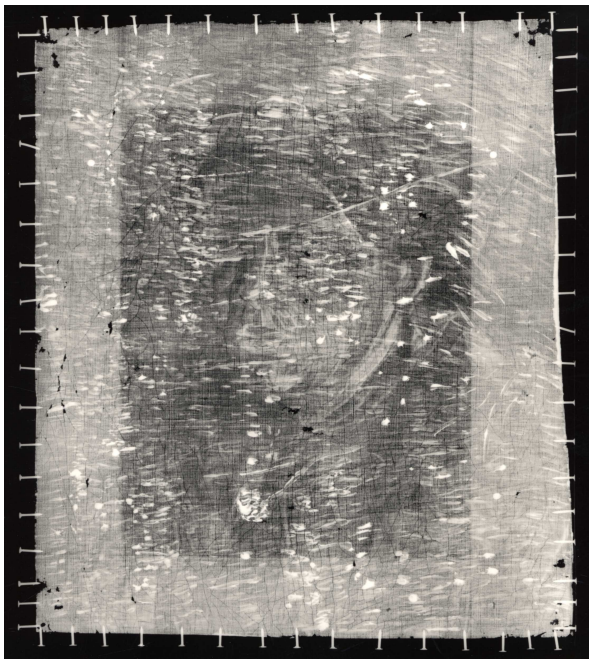
on masonite: no canvas  
structure!

Truly blind



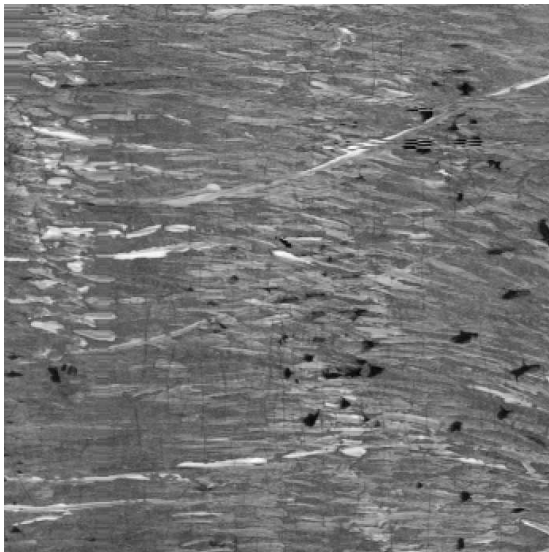




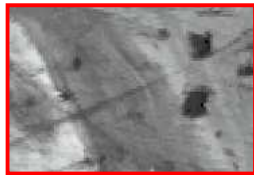




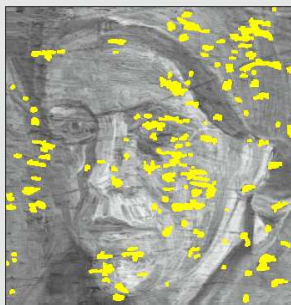




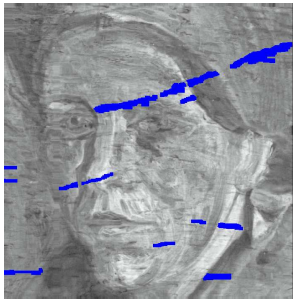


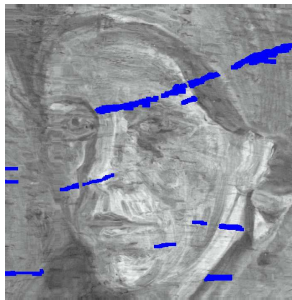


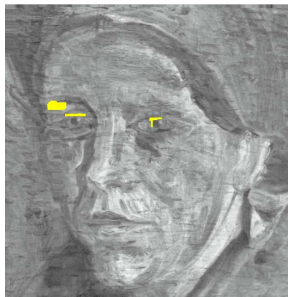


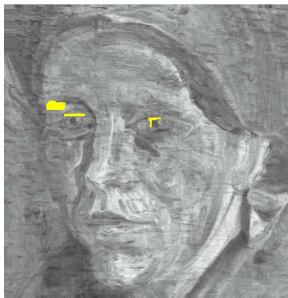
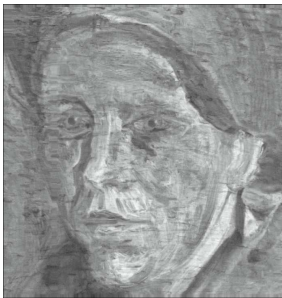




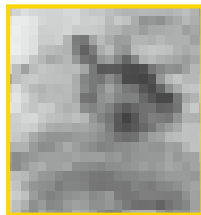
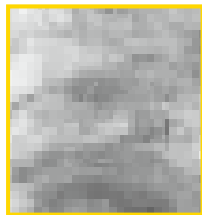
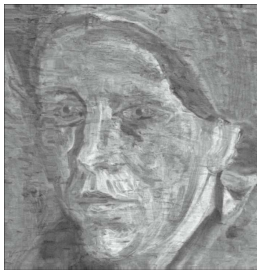








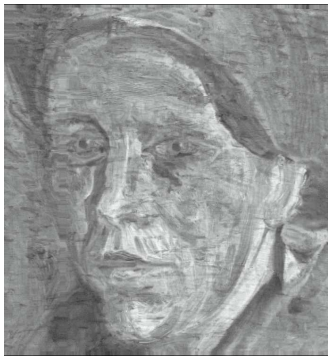












**Sb**



**Hg**







