

# Reading QR codes on challenging surfaces

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## Deformations on QR Codes

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## QR codes

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- A type of 2D (or matrix) barcode.
- Created by the company Denso Wave in the decade of the 90s.
- Internationally standardized in the 2000, and has been updated in two occasions, with the current standard from 2015.



## Version of QR codes

Version 2



## Version of QR codes

Version 7

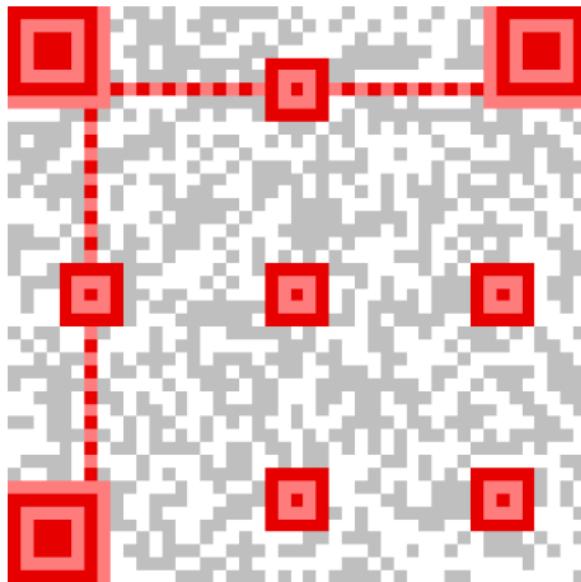


## Structure of QR codes



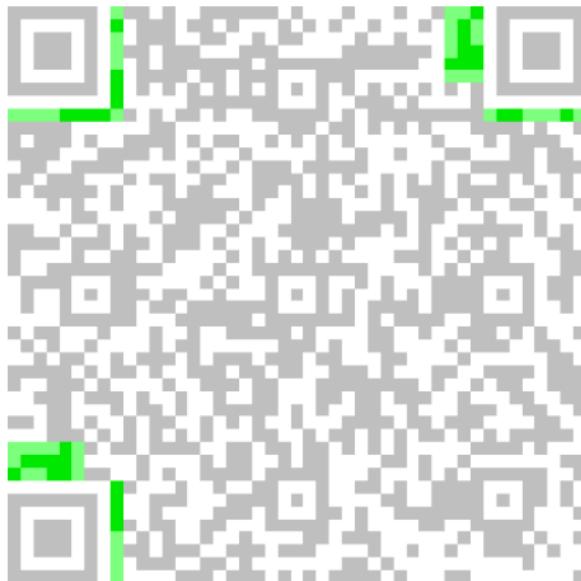
# Structure of QR codes

## Function patterns



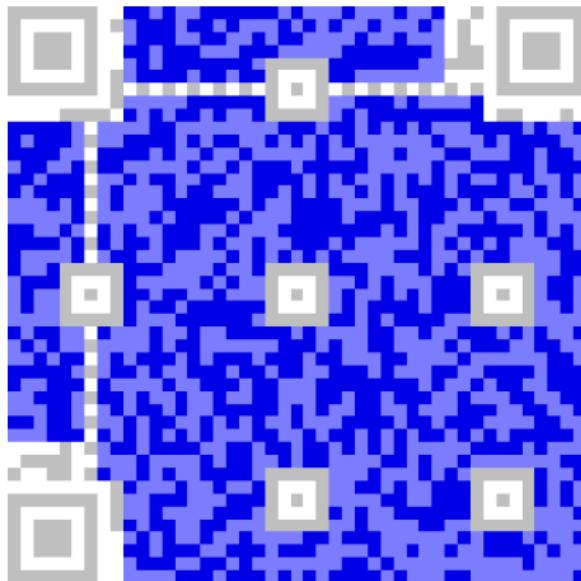
# Structure of QR codes

Encoding region

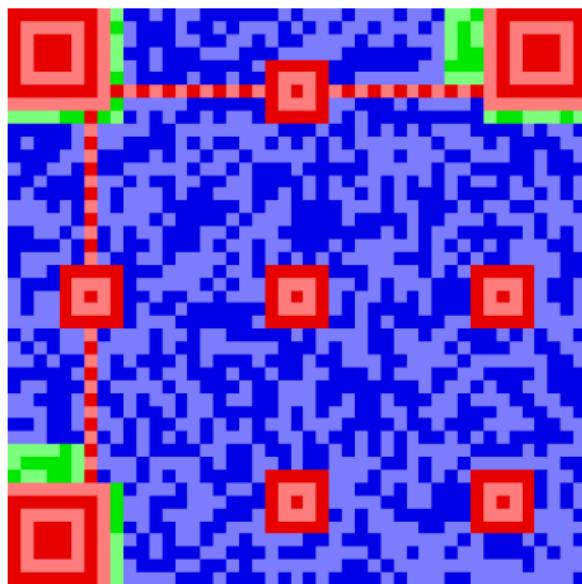


# Structure of QR codes

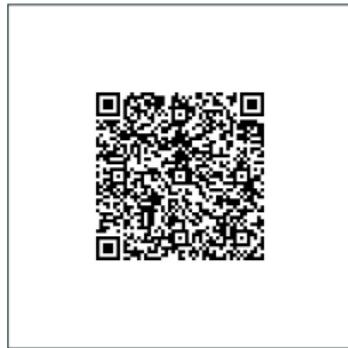
Content region



# Structure of QR codes



# The problem: Deformations



(1)



(2)



(3)

# The problem: Deformations



(1)



(2)



(3)

(1) No deformation

# The problem: Deformations



(1)



(2)

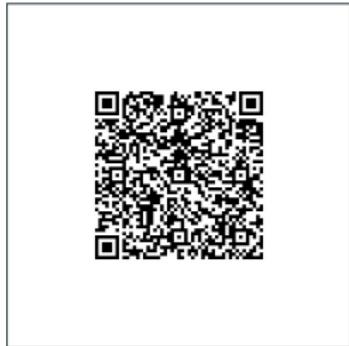


(3)

(1) No deformation

(2) Perspective deformation from camera view

# The problem: Deformations



(1)



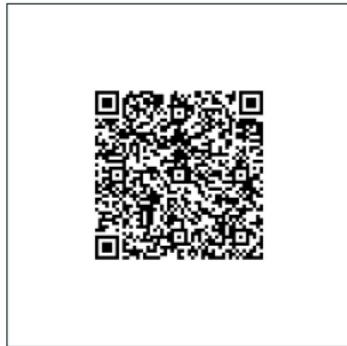
(2)



(3)

- (1) No deformation
- (2) Perspective deformation from camera view
- (3) Intrinsic deformation from the surface

# The problem: Deformations



(1)



(2)



(3)

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# Objectives

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- Implementation and a comparison of four correction methods for deformations of QR Codes.

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- Integrate a third party decoder for the reading of the data.

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- Implementation and a comparison of four correction methods for deformations of QR Codes.
- Make a custom modular QR decoding library.
- Implement a localizer of QR codes from scratch.
- Integrate a third party decoder for the reading of the data.
- Create datasets to extract some results from the comparison of corrections.

# Localization

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## How we localize a QR code?



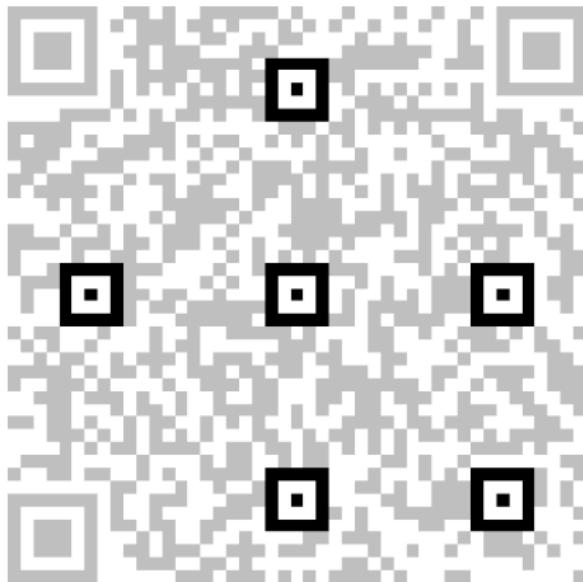
# How we localize a QR code?

Finder patterns



# How we localize a QR code?

Alignment patterns



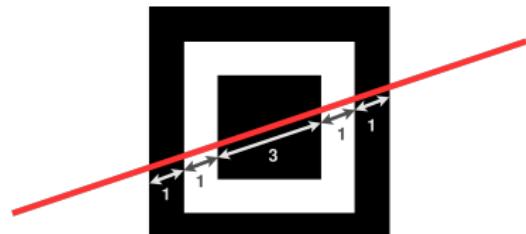
# How we localize a QR code?

Timing patterns



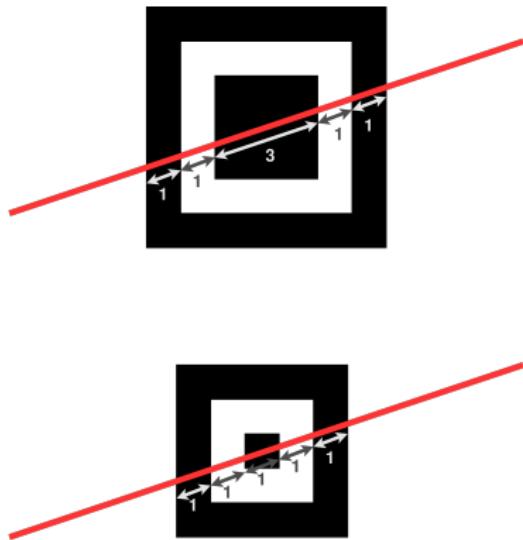
# Finder and alignment patterns

- The standard ratio-based algorithm.



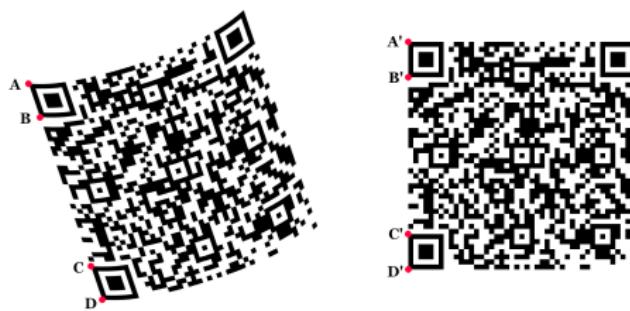
## Finder and alignment patterns

- The standard ratio-based algorithm.
- Based on the property that all the lines crossing the pattern by the center follow a constant ratio of black and white pixels.



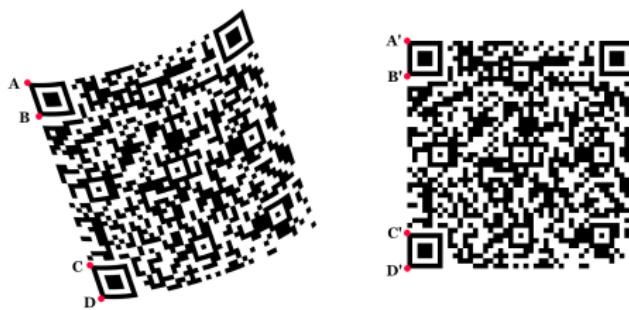
# Version

- Algorithm presented for cylindrical deformation, which we will name cross ratio method.



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- Algorithm presented for cylindrical deformation, which we will name cross ratio method.
- Uses the assumption that at least one side of the QR Code is close to being linear.



## Correction

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## Correction methods

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We will compare four different correction methods in this work:

- Affine (AFF)
- Projective (PRO)
- Cylindrical (CYL)
- Thin Plate Spline (TPS)

## Affine (AFF)

- Simplest method of correction,  
equivalent to the one of the  
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- Simplest method of correction, equivalent to the one of the standard.
- Based on constructing an affine transformation matrix.
- Equivalent to a linear transformation (rotation, resizing or skew) and a translation.



# Projective (PRO)

- The most common method used for correction.



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- The most common method used for correction.
- Based on constructing a projective transformation matrix.



## Projective (PRO)

- The most common method used for correction.
- Based on constructing a projective transformation matrix.
- Extension of the affine method, which can correct the perspective deformation from the camera view.



## Cylindrical (CYL)

- Appeared in recent papers to solve the particular case of cylindrical deformation.



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- Appeared in recent papers to solve the particular case of cylindrical deformation.
- Composition of a projective transformation and a non-linear projection to a cylinder.
- When applied to a flat surface, should be equivalent to a projective transformation.



# Thin Plate Spline (TPS)

- Our proposal of a surface independent correction method.



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- The Thin Plate Spline is a radial basis function with very good general interpolation properties.



# Thin Plate Spline (TPS)

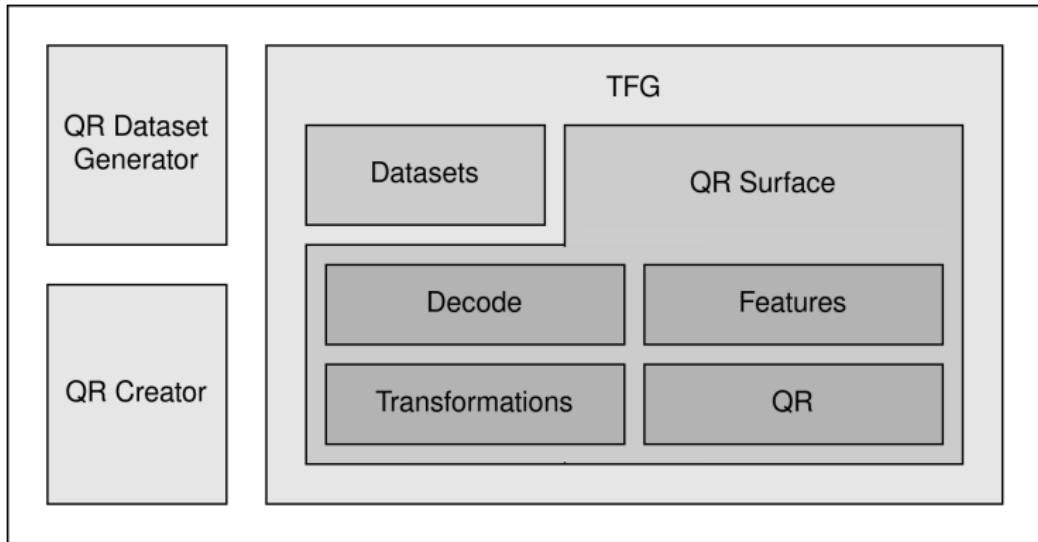
- Our proposal of a surface independent correction method.
- The Thin Plate Spline is a radial basis function with very good general interpolation properties.
- The method uses a set of reference points to interpolate an arbitrary non-linear transformation.



## Implementation

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# Implementation by modules



# Example of QR Surface

```
image = imageio.imread(image_path)

for qr in QRCode.from_image(image):
    qr.correct(method=Correction.PROJECTIVE)
    data = qr.decode()

    print(data)
    qr.plot(show=True)
```

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Multiple QR support

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Multiple correction methods

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Integrated QR decoding

# Example of QR Surface

## Integrated plotting

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image = imageio.imread(image_path)

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    data = qr.decode()

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```

# Results

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# Datasets



(1)



(2)



(3)

# Datasets



(1)



(2)



(3)

- (1) 50 photos of QR codes in flat surfaces. This dataset has images with more than one QR code.

# Datasets



(1)



(2)



(3)

- (1) 50 photos of QR codes in flat surfaces. This dataset has images with more than one QR code.
- (2) 50 photos of QR codes in cylindrical and arbitrary surfaces.

# Datasets



(1)



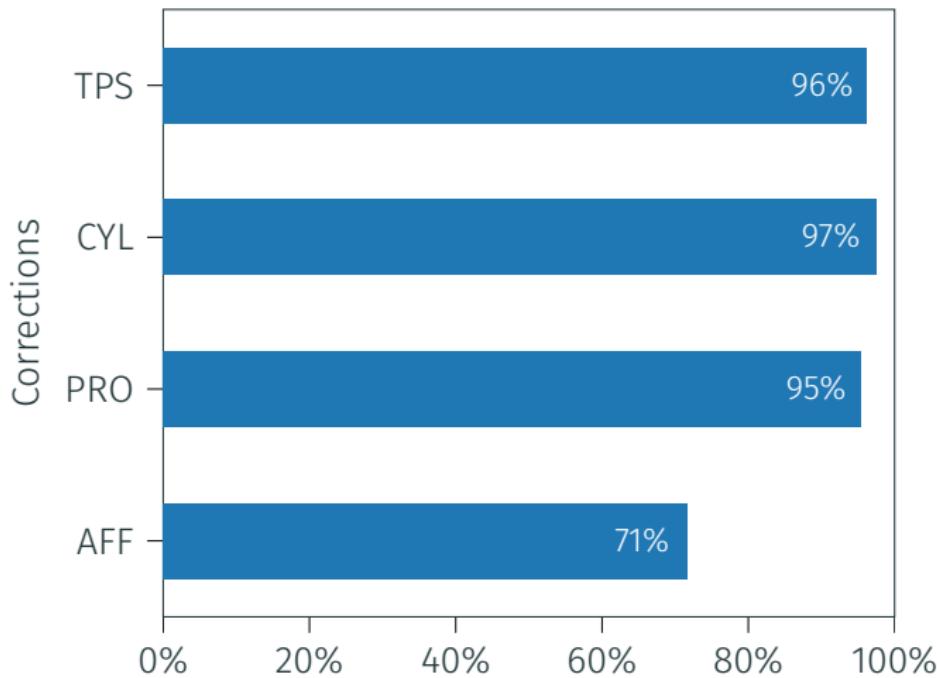
(2)



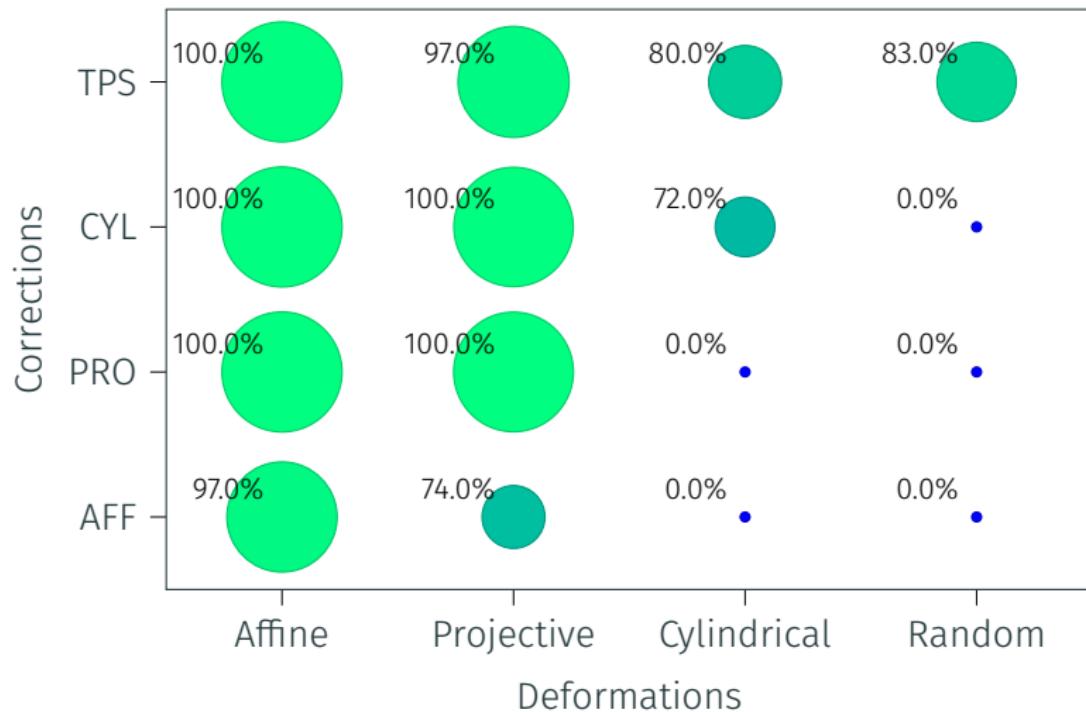
(3)

- (1) 50 photos of QR codes in flat surfaces. This dataset has images with more than one QR code.
- (2) 50 photos of QR codes in cylindrical and arbitrary surfaces.
- (3) 819 synthetic images of QR codes with perspective deformation.

## Successful decoding by correction



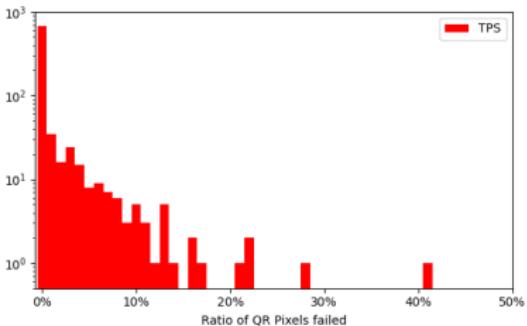
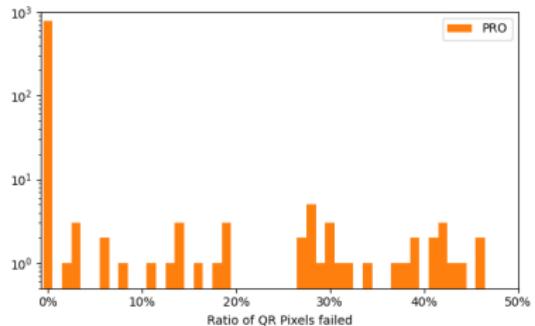
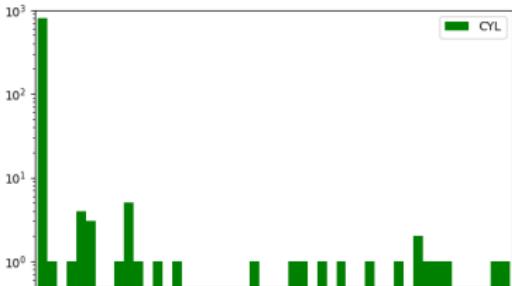
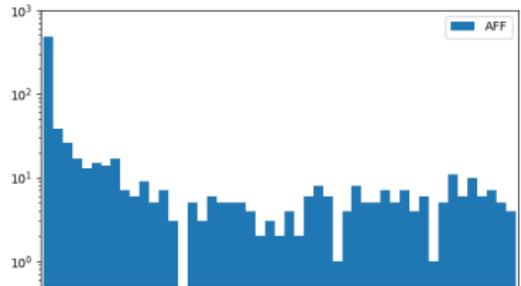
# Successful decoding by deformation and correction



## Ratio of QR pixels failed



# Ratio of QR pixels failed by correction



## Conclusion

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- Affine and projective methods can't correct nearly any case of challenging deformation.
- The cylindrical method works well with flat QR Codes, while being able to achieve good results in the cases with cylindrical deformation, but it can't correct the arbitrary deformations.
- Thin Plate Spline, overcome all our expectations, being close to the other methods in flat deformation images, while being able to correct cylindrical and arbitrary deformations.

## Further work

- Try to solve the problem of localization of QR Code features in arbitrary deformations.

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- Try to solve the problem of localization of QR Code features in arbitrary deformations.
- Implement different decoding backends, with more commercial decoders or a handmade one.
- Create greater datasets and extract more meaningful results.

Questions?