

OpenCV 3.0

Uses in Robotics and AR

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VP Perception and Core Software,
Magic Leap

Director: OpenCV Foundation



OpenCV Thanks! For Key Support

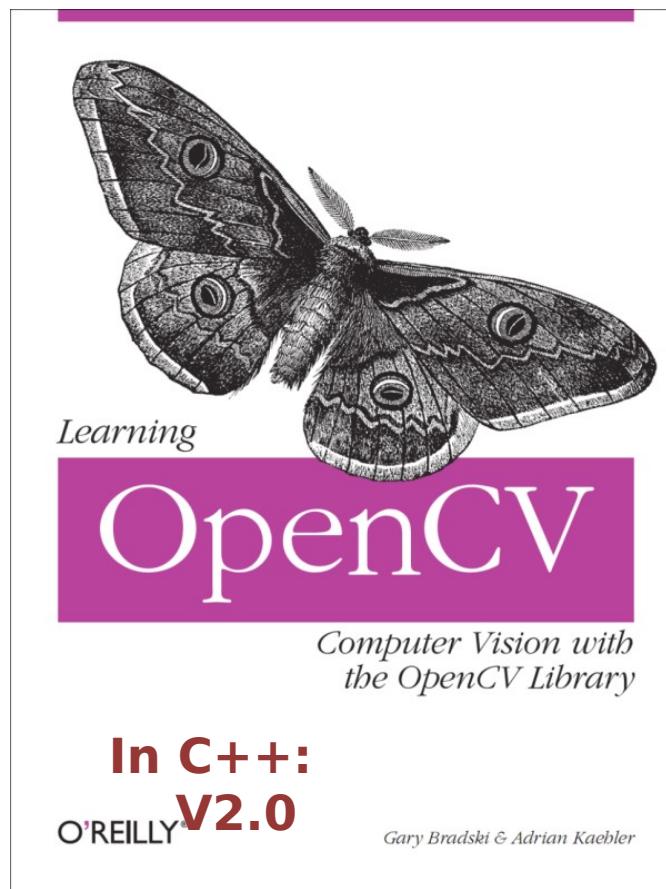
- Intel
 - for getting it started and helping fund the challenge
- Google
 - for growing support in Google Summer of Code over the last 5 years
- Nvidia
 - Supporting Cuda version with lots of other help

Outline: OPENCV 3.0

- **Intro**
 - Learning OpenCV Version 2.0 coming by Aug
 - Announcing \$50K Vision Challenge
- **OpenCV Background**
- **OpenCV 3.0 High Level**
- **OpenCV 3.0 Modules**
- **Brand New in OpenCV**
- **OpenCV Examples**
 - Robotics
 - Augmented Reality

Learning OpenCV V2.0

- Out in Summer 2014!



OpenCV \$50K Vision Challenge

VisionChallenge

More information soon 10/03/2014

OpenCV is launching a community-wide challenge to update and extend the OpenCV library. An award pool of \$50,000 will be provided to the best performing algorithms in the following 10 CV application areas:

- image segmentation,
- image registration,
- human pose estimation,
- SLAM,
- multi-view stereo matching,
- object recognition,
- face recognition,
- gesture recognition,
- action recognition, and
- text recognition.

We will soon provide code to read from existing data sets in each of these areas.

Conditions:

The OpenCV Vision Challenge Committee will judge up to five best entries.

1. You may submit a new algorithm developed by yourself
2. You may submit an existing algorithm **whether or not developed by yourself** (as long as you re-implement it yourself or it already has a BSD or compatible license).
3. You must submit your winning code as an OpenCV pull request under a BSD or compatible license
 1. You acknowledge that your code may be included, with citation, in OpenCV

You may explicitly enter code for any work you have submitted to CVPR 2015 or its workshops. We will not unveil it until after CVPR.

Winners and prizes are at the sole discretion of the committee.

Timeline:

Submission Period:

Now - May 8th 2015

Winners Announcement:

June 8th 2015 at CVPR 2015

Contact:

For more information, go to <http://code.opencv.org/projects/opencv/wiki/VisionChallenge>

Or mail:

opencv_vision_challenges@googlegroups.com

The group is located at: https://groups.google.com/forum/?hl=en#!forum/opencv_vision_challenges

OpenCV Background

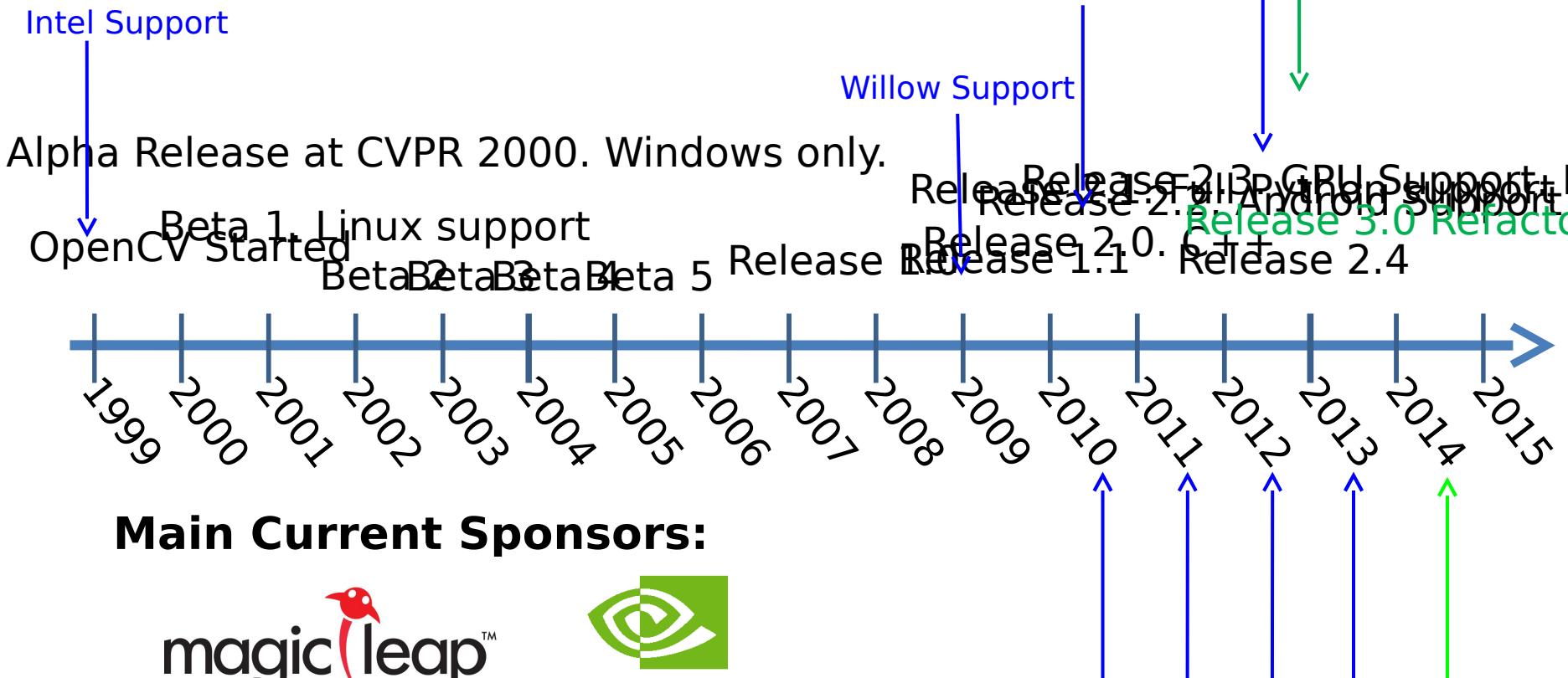
What is OpenCV

- **Open Source Computer Vision Library**
- Routines focused on real time image processing and 2D + 3D computer vision.
 - **On Linux, Windows, Mac, Android and iOS**
 - **C++, C, Java, Matlab and Python interfaces**
- **Free** for commercial or research use in whole or in part.

OpenCV License

- Based on **BSD license**
- Free for **commercial** and research use
- Does **not force** your code to be open
- You need not contribute back
 - But you are very welcome to contribute back!

OpenCV History



Main Current Sponsors:



Environments, Platforms

- Languages:
 - C++, C#, Python, C, Java
- Platforms:



OpenCV and Hardware Acceleration

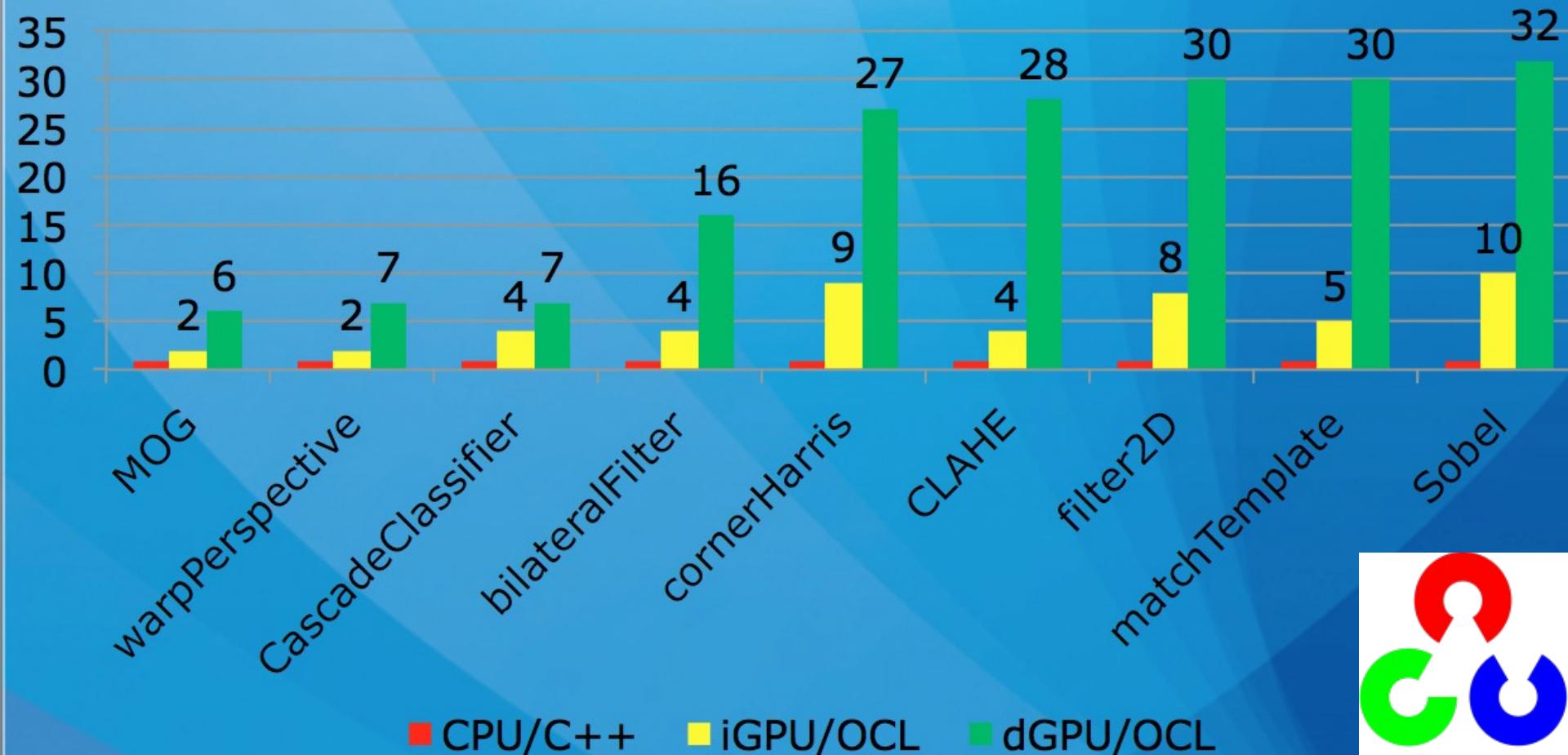
- OpenCV was a central basis for OpenVX
 - a hardware abstraction layer
 - for embedded vision acceleration

OpenVX Supporters:



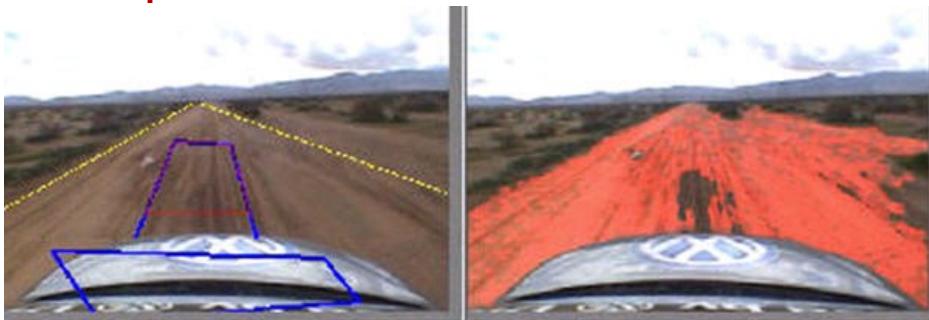
OpenCL™ performance in OpenCV 3.0

AMD A10-7850k (Kaveri) and Radeon HD7790



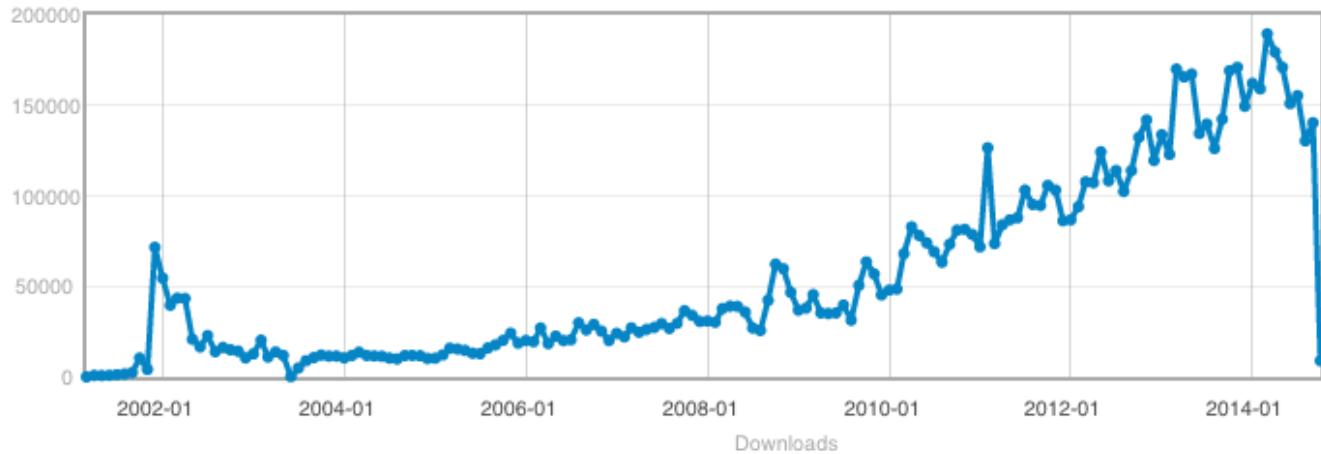
Where is OpenCV Used?

- Academic and Industry Research
- Security systems
- Google Maps, Streetview
- Image/video search and retrieval
- Structure from motion in movies
- Machine vision factory production inspection systems
- Automatic Driver Assistance Systems
- Safety monitoring (Dam sites, mines, swimming pools)
- Robotics – personal, industrial, hobby
- Coin production in China



Popularity

Over 9M downloads!



DOWNLOADS

9,024,781

In the selected date range

TOP COUNTRY *

China

13% of downloaders

TOP OS *

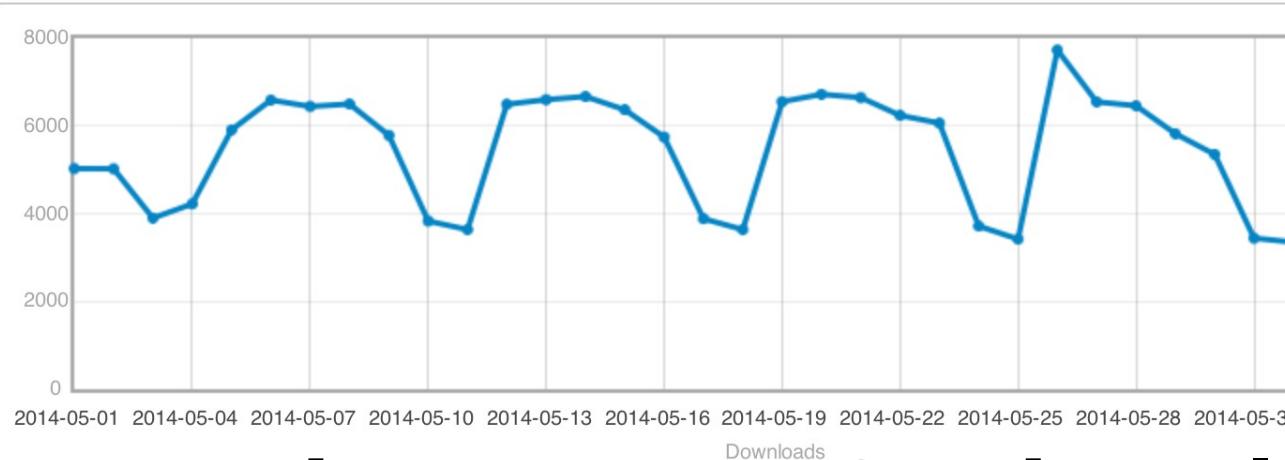
Windows

73% of downloaders

Brought to you by: akamaev, alalek, ashishkov, asmorkalov, and 6 others

[Home](#) (Change File)

Date Range: 2014-05-01 to 2014-06-01



DOWNLOADS

174,346

In the selected date range

TOP COUNTRY

China

20% of downloaders

TOP OS

Windows

69% of downloaders

Ramping to > 160K downloads/month

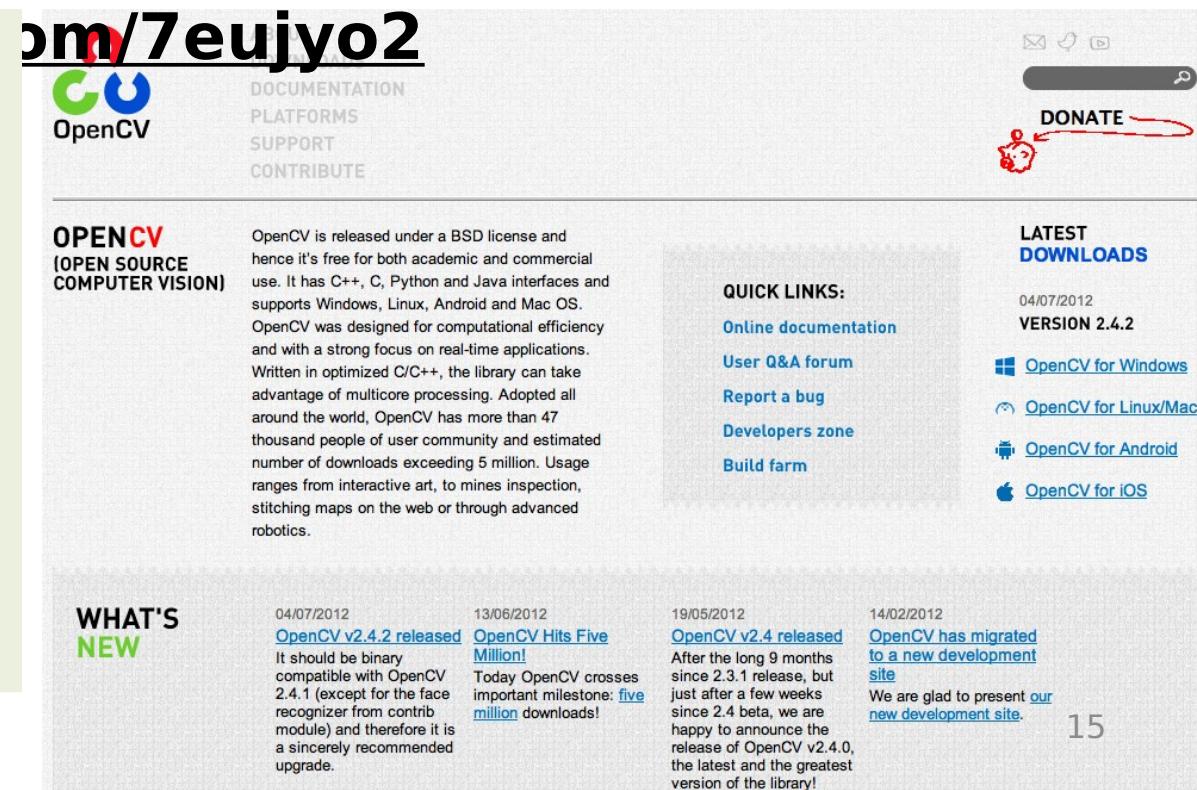
OpenCV Corporation

- **Founded this July, 2012**
- Documentation:
<http://opencv.org> (user site)
<http://docs.opencv.org>
- <http://code.opencv.org> (developer site)
- **Contribute (via Credit, debit or paypal):**

For corporate support
And/or partnership, contact
Garybradski@gmail.com

I am looking for
entrepreneurial people to
staff up OpenCV:

- Vision
- Business Dev
- Software
- Hardware



The screenshot shows the official OpenCV website. At the top right, there are social media icons for email, GitHub, YouTube, and a search bar. Below that is a "DONATE" button with a red arrow pointing to it. The main navigation menu includes links for DOCUMENTATION, PLATFORMS, SUPPORT, and CONTRIBUTE. On the left, there's a sidebar with a "WHAT'S NEW" section listing recent news items. The main content area features a large image of a hand holding a smartphone displaying the text "OpenCV/7eujyo2". To the right of the image, there's a detailed description of what OpenCV is and its features. Further down, there's a "LATEST DOWNLOADS" section with links to various platform-specific versions.

WHAT'S NEW

- 04/07/2012 [OpenCV v2.4.2 released](#)
- 13/06/2012 [OpenCV Hits Five Million!](#)
- 19/05/2012 [OpenCV v2.4 released](#)
- 14/02/2012 [OpenCV has migrated to a new development site](#)

LATEST DOWNLOADS

- 04/07/2012 VERSION 2.4.2
 - [OpenCV for Windows](#)
 - [OpenCV for Linux/Mac](#)
 - [OpenCV for Android](#)
 - [OpenCV for iOS](#)

What's In OpenCV

- High level



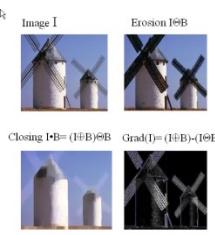
OpenCV

Developer

OpenCV Overview:

Robot support
 > 2500 algorithms

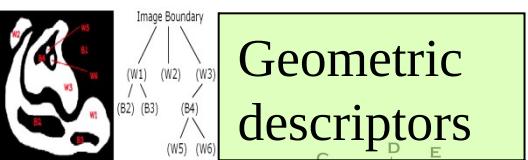
<http://code.opencv.org>; User: <http://opencv.org>



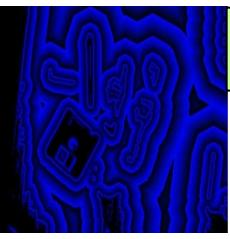
General Image Processing Functions



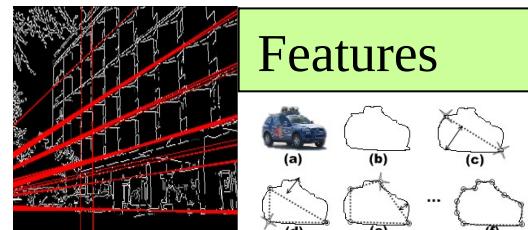
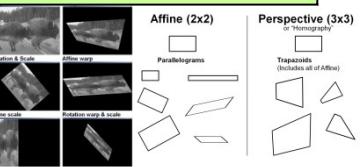
Segmentation



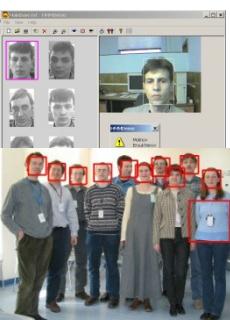
Geometric descriptors



Transforms

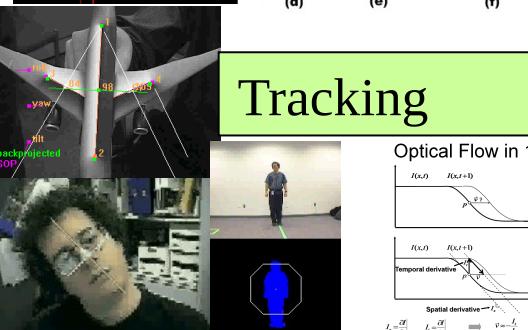
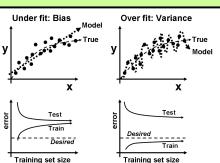


Features

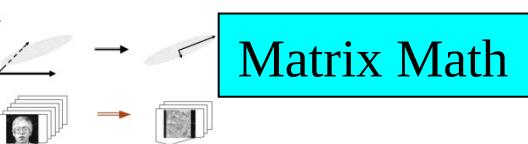


Machine Learning:

- Detection,
- Recognition



Tracking



Matrix Math

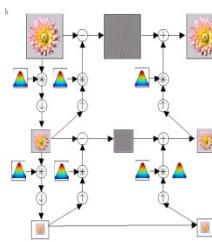
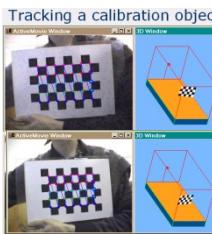
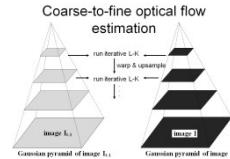
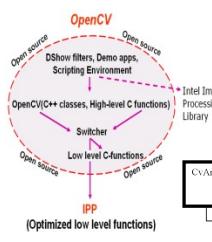


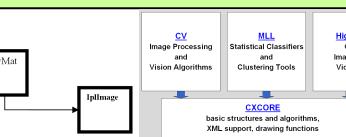
Image Pyramids



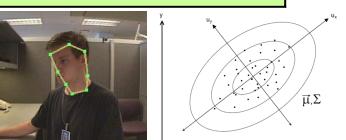
Camera calibration, Stereo, 3D



Utilities and Data Structures



Fitting



17

OpenCV Algorithm Modules Overview

HighGUI:
I/O, Interface



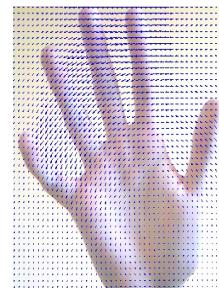
Image
Processing



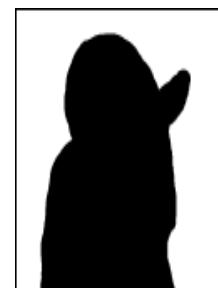
Transforms



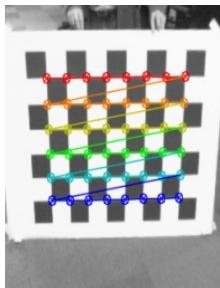
Fitting



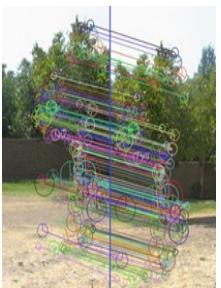
Optical Flow
Tracking



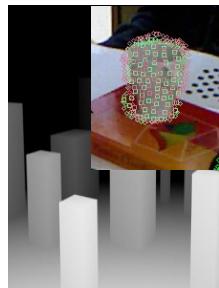
Segmentatio
n



Calibration



Features
VSLAM



Depth, Pose
Normals,
Planes, 3D



Object
recognition
Machine



Computational
Photography

CORE:

Data structures, Matrix math, Exceptions
etc

Machine Learning Library (MLL)

CLASSIFICATION / REGRESSION

Fast Approximate NN (FLANN)

Extremely Random Trees

CART

Naïve Bayes

MLP (Back propagation)

Statistical Boosting, 4 flavors

Random Forests

SVM

Face Detector

(Histogram matching)

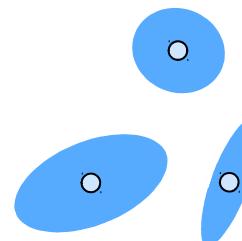
(Correlation)

CLUSTERING

K-Means

EM

(Mahalanobis distance)



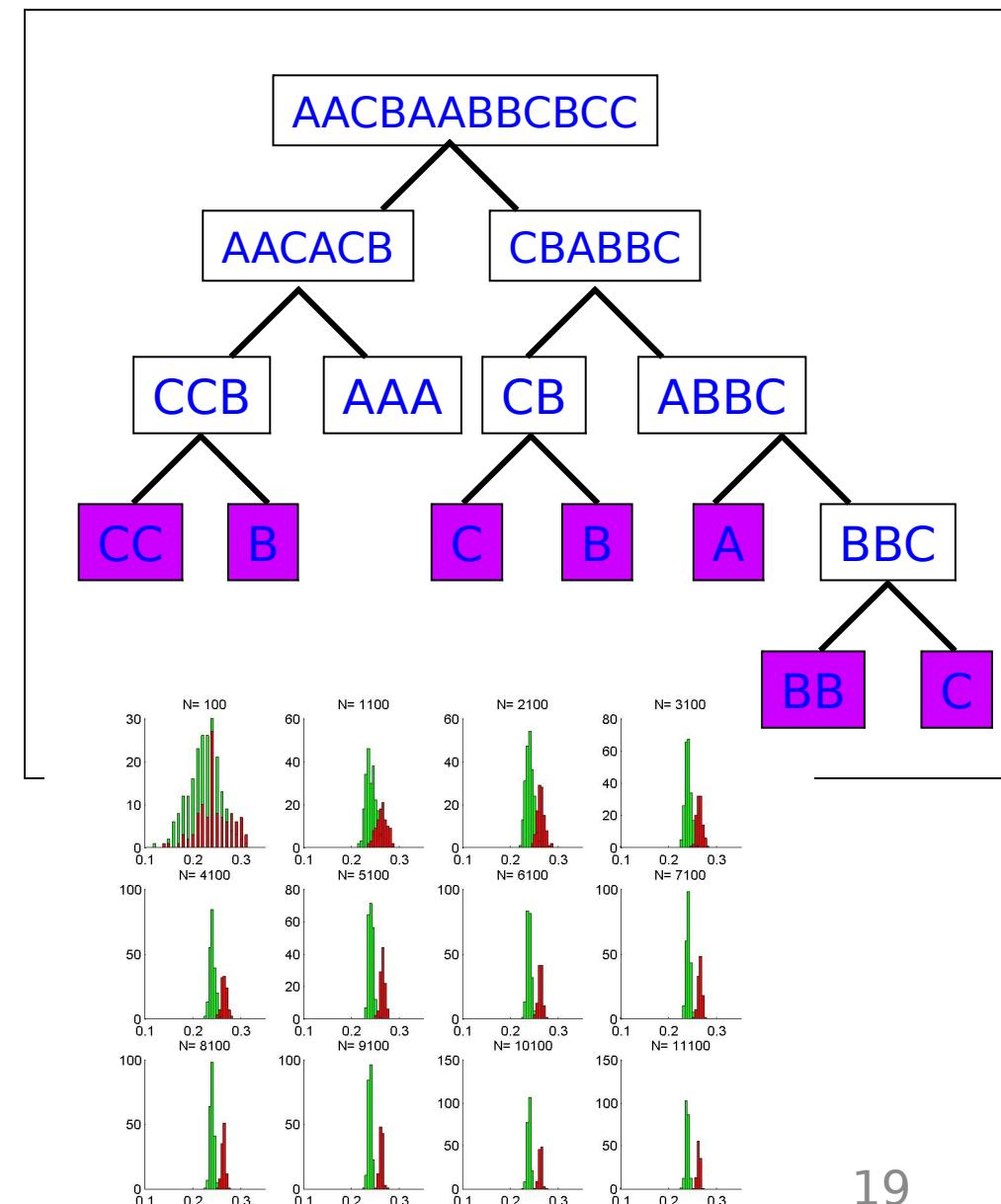
TUNING/VALIDATION

Cross validation

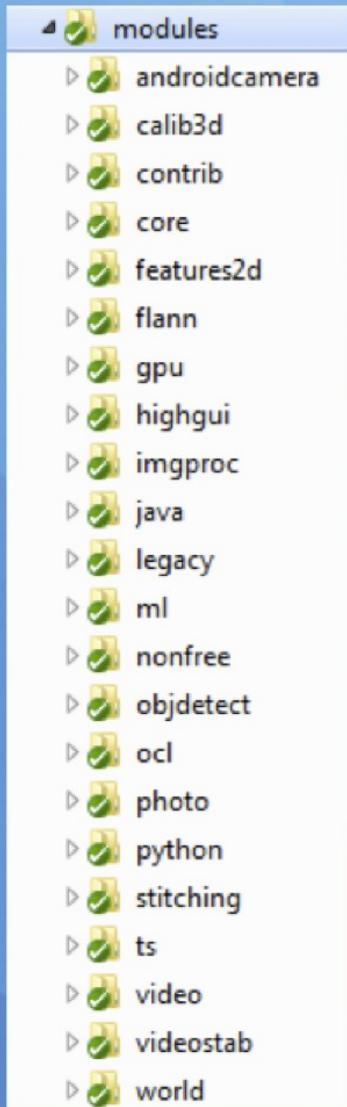
Bootstrapping

Variable importance

Sampling methods



Modules



Algorithmic

- **core, imgproc, calib3d, video, ml, objdetect, features2d**
- **photo, stitching, videostab, superres**
- **contrib, legacy, nonfree, flann**

GPU

- **gpu, ocl**

Infrastructure

- **highgui, world**
- **python, java**
- **ts, androidcamera**

C vs C++ API: Focus Detector

C

```
double calcGradients(const IplImage *src,
                      int aperture_size = 7)
{
    CvSize sz = cvGetSize(src);

    IplImage* img16_x = cvCreateImage(sz, IPL_DEPTH_16S, 1);
    IplImage* img16_y = cvCreateImage(sz, IPL_DEPTH_16S, 1);
    cvSobel(src, img16_x, 1, 0, aperture_size);
    cvSobel(src, img16_y, 0, 1, aperture_size);

    IplImage* imgF_x = cvCreateImage(sz, IPL_DEPTH_32F, 1);
    IplImage* imgF_y = cvCreateImage(sz, IPL_DEPTH_32F, 1);
    cvScale(img16_x, imgF_x);
    cvScale(img16_y, imgF_y);

    IplImage* magnitude = cvCreateImage(sz, IPL_DEPTH_32F, 1);
    cvCartToPolar(imgF_x, imgF_y, magnitude);
    double res = cvSum(magnitude).val[0];

    cvReleaseImage(&magnitude );
    cvReleaseImage(&imgF_x);
    cvReleaseImage(&imgF_y);
    cvReleaseImage(&img16_x);
    cvReleaseImage(&img16_y);

    return res;
}
```

C++

```
double contrast_measure(Mat& img)
{
    Mat dx, dy;

    Sobel(img, dx, 1, 0, 3, CV_32F);
    Sobel(img, dy, 0, 1, 3, CV_32F);
    magnitude(dx, dy, dx);

    return sum(dx)[0];
}
```

OpenCV Architecture and Development

Languages:

C
C++
Python
CUDA
JAVA (plans)

Technologies:

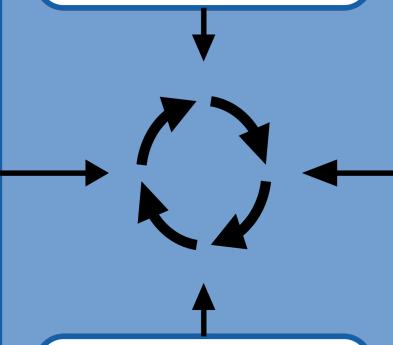
CUDA
SSE
TBB

3rd party libs:

Eigen
IPP
Jasper
JPEG, PNG
OpenNI
QT
TBB
VideoInput

Development:

Maintainers
Contributors



QA:

Buildbot
Google Tests

Modules:

Core
ImgProc
HighGUI
GPU
ML
ObjDetect
Video
Calib3D
Features2D
FLANN

Target archs:

X86
X64
ARM
CUDA

Target OS:

Windows
Linux
Mac OS
Android

Web resources

The image displays three browser tabs side-by-side:

- OpenCV | OpenCV**: Shows the main OpenCV documentation page with the OpenCV logo, navigation links like "Table Of Contents", "Next topic", and "This Page", and a "WHAT'S NEW" section.
- Welcome to opencv.org**: Shows the OpenCV 2.4.4.0 documentation page with the title "OpenCV 2.4.4.0 documentation".
- Questions - OpenCV Q&A**: Shows the answers.opencv.org Q&A page. It features a search bar, navigation buttons ("ALL", "UNANSWERED"), and a list of questions. The first few questions are:
 - OpenCV C++ Drawing and Analyzing Line (by Tomazl, 2 hours ago)
 - how to understand bayes classifier training method? (by franker, 3 hours ago)
 - opencv execution (by murnesty, 3 hours ago)
 - transform phase map to 3D (by nmm02003, 3 hours ago)
 - Drawing a Ling from set of points (by Tomazl, 6 hours ago)
 - Open CV & C++ (by Tomazl, 6 hours ago)A sidebar on the right shows "Contributors" (with small profile pictures) and a "Tags" section listing various topics with their counts: AndroidOpenCV (4), C++.OpenCV (4), c++ (3), Initialization (2), java (2), opencv (2), 2d (1), 3d (1), and accuracy (1).

opencv.org, docs.opencv.org, answers.opencv.org

Development infrastructure

The screenshot displays four browser tabs side-by-side:

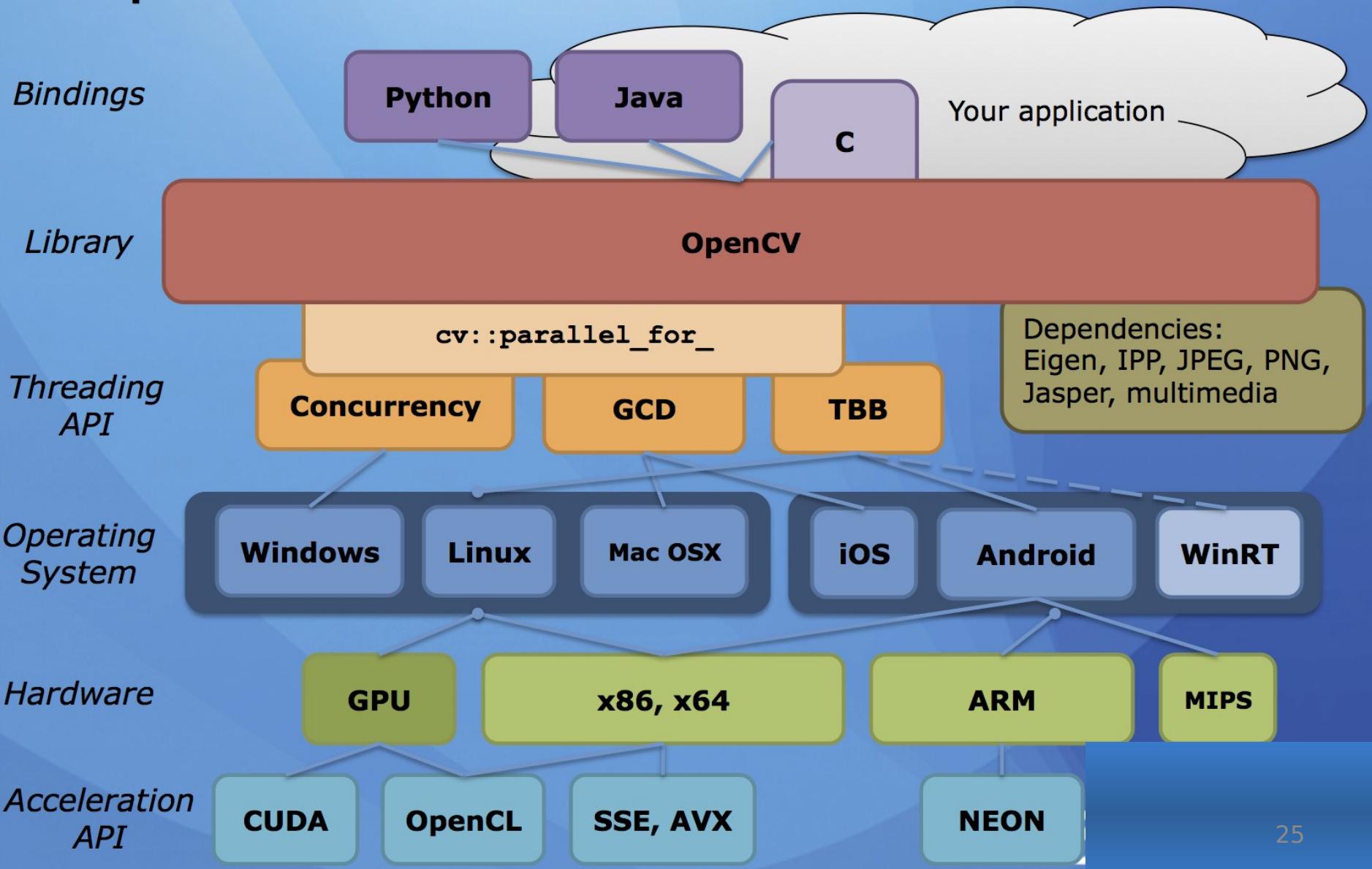
- GitHub (itseez/opencv)**: Shows a repository with 1000+ commits, a merge pull request #1107, and a SpecLab authored by opencv-pushbot.
- OpenCV Wiki**: A placeholder page for the OpenCV Wiki.
- BuildBot: Open Source Computer Vision**: A status page showing build results for various platforms (Win, Lin, Lin2, Mac, And, Doc) across different branches (master, 2.4).
- pullrequest.opencv.org**: A Waterfall Report titled "Active pull requests to itseez/opencv". It lists 16 pull requests, their titles, descriptions, and build statistics across multiple platforms.

Active pull requests to itseez/opencv

Total 16	ID	Branch	Title and description	Win	Lin	Lin2	Mac	And	Doc	Author	Assigned to	Mer...
	406	master	Fixed DynamicAdaptedFeatureDetector (#1334) Mono / .NET bindings hi, using IKVM (http://www.ikvm.net/) I've created bindings for Mono / .NET using the existing java bindings. In order to get them built, IKVM needs to be in the system's PATH environment variable. I modified the java for desktop bindings a little so they do the System.loadLibrary call on their own. doing it the same way as in the java examples (letting the user call it) doesn't work in .NET due to different class loading behaviour. I'm fairly new to CMake, so any hints/help in that direction are appreciated - for example I've no clue what'd be the proper way to copy native dependencies (ikvm-native-win32) based on the current target platform (x86/x64). I'd like to see an output folder like this: mono/opencv-mono.dll - the mono bindings mono/IKVM.*.dll - managed assemblies needed by opencv-mono.dll mono/x86/opencv_java249.dll - native dependency needed by opencv-mono.dll mono/x86/ikvm-native-win32-x86.dll - native dependency needed by IKVM.Runtime.JNI.dll mono/x64/... I've not yet written any tests yet. simply tried some basic examples which worked just fine. wanted to sort out above mentioned build issues first. thanks, elias	3042 fail	3055 fail	563 fail	2932 fail	1942 fail	2014 fail	ilysenkov	vpisarev	Unsucc...
	604	master	Merge pull request #102 from opencv-pushbot/... ffmpeg_wrapper: build fix f05f374fb5db... alexander updated tutorial, rapid spell check fix ffmpeg_wrapper: build fix e55b2f7d6075... marina.k Merge pull request #99 from opencv-pushbot/... ffmpeg_wrapper: build fix e475010e1451... alexander updated first image sample ffmpeg_wrapper: build fix e0fc0ccf5de... morozov	2995 fail	3008 fail	516 fail	2885 fail	1895 fail	1967 fail	azeno	apavlenko	Unsucc...
	649	master	latency patch see http://code.opencv.org/issues/632	2912 fail	2917 fail	422 fail	2789 success	1801 fail	1873 success	eendebakpt	vpisarev	Unsucc...
	674	master	Bugfix to potential inaccuracy in function:polyfit 1.Modify the default datatype(CV_32F) to CV_64F. 2.Re-write the generation of X matrix, reducing the times of multiplication. The problem has been reported at http://code.opencv.org/issues/2887	2987 success	3000 success	508 success	2877 success	1887 success	1959 success	chouilee	vpisarev	Under...
	685	2.4	Fixed compatibility issues with libavcodec > 53.25.0 Post libavcodec 53.25.0 the enum CodecID was changed to AVCodecID causing compilation errors saying CodecID was not previously declared.	3083 success	3096 success	604 success	2973 success	1984 success	2056 success	shachibista	vpisarev	Under...
			Make TV-L1 rescaling flexible and add median filtering Previously the pyramid was done with a rescaling factor of 2 (implied by the use of pyrDown). This often leads to inferior results									

<https://github.com/buildopencv>,

OpenCV Environment



What's In OpenCV 3.0

- Modules

OpenCV Modules: Core

OpenCV 2.3 Core

The OpenCV C++ reference manual is here:
<http://opencv.willowgarage.com/documentation/cpp/>.
 Use Quick Search to find descriptions of the particular functions and classes

Key OpenCV Classes

<code>Point</code>	Template 2D point class
<code>Point3</code>	Template 3D point class
<code>Size</code>	Template size (width, height) class
<code>Vec</code>	Template short vector class
<code>Matx</code>	Template small matrix class
<code>Scalar</code>	4-element vector
<code>Rect</code>	Rectangle
<code>Range</code>	Integer value range
<code>Mat</code>	2D or multi-dimensional dense array (can be used to store matrices, images, histograms, feature descriptors, voxel volumes etc.)
<code>SparseMat</code>	Multi-dimensional sparse array
<code>Ptr</code>	Template smart pointer class

Matrix Basics

Create a matrix

```
Mat image(240, 320, CV_8UC3);
[Re]allocate a pre-declared matrix
image.create(480, 640, CV_8UC3);
```

Create a matrix initialized with a constant

```
Mat A33(3, 3, CV_32F, Scalar(5));
Mat B33(3, 3, CV_32F); B33 = Scalar(5);
Mat C33 = Mat::ones(3, 3, CV_32F)*5.;
Mat D33 = Mat::zeros(3, 3, CV_32F) + 5.;
```

Create a matrix initialized with specified values

```
double a = CV_PI/3;
Mat A22 = (Mat<float>(2, 2) <<
    cos(a), -sin(a), sin(a), cos(a));
float B22data[] = {cos(a), -sin(a), sin(a), cos(a)};
Mat B22 = Mat(2, 2, CV_32F, B22data).clone();
```

Initialize a random matrix

```
randu(image, Scalar(0), Scalar(256)); // uniform dist
randn(image, Scalar(128), Scalar(10)); // Gaussian dist
```

Convert matrix to/from other structures

(without copying the data)

```
Mat image_alias = image;
float* Idata=new float[480*640*3];
Mat I(480, 640, CV_32FC3, Idata);
vector<Point> iptvec(10);
Mat iP(iptvec); // iP - 10x1 CV_32SC2 matrix
IplImage* oldC0 = cvCreateImage(cvSize(320, 240), 16, 1);
Mat newC = cvarrToMat(oldC0);
IplImage oldC1 = newC; CvMat oldC2 = newC;
... (with copying the data)
Mat newC2 = cvarrToMat(oldC0).clone();
vector<Point2f> ptvec = Mat<Point2f>(iP);
```

Access matrix elements

```
A33.at<float>(i,j) = A33.at<float>(j,i)+1;
Mat dyImage(image.size(), image.type());
for(int y = 1; y < image.rows-1; y++) {
    Vec3b* prevRow = image.ptr<Vec3b>(y-1);
    Vec3b* nextRow = image.ptr<Vec3b>(y+1);
    for(int x = 0; y < image.cols; x++)
        for(int c = 0; c < 3; c++)
            dyImage.at<Vec3b>(y,x)[c] =
                saturate_cast<uchar>(
                    nextRow[x][c] - prevRow[x][c]);
}
Mat<Vec3b>::iterator it = image.begin<Vec3b>(),
    itEnd = image.end<Vec3b>();
for( it != itEnd; ++it)
    (*it)[1] ^= 255;
```

Matrix Manipulations: Copying, Shuffling, Part Access

<code>src.copyTo(dst)</code>	Copy matrix to another one
<code>src.convertTo(dst,type,scale,shift)</code>	Scale and convert to another datatype
<code>m.clone()</code>	Make deep copy of a matrix
<code>m.reshape(nch,nrows)</code>	Change matrix dimensions and/or number of channels without copying data
<code>m.row(i), m.col(i)</code>	Take a matrix row/column
<code>m.rowRange(Range(i1,i2))</code>	Take a matrix row/column span
<code>m.colRange(Range(j1,j2))</code>	
<code>m.diag(i)</code>	Take a matrix diagonal
<code>m(Range(i1,i2),Range(j1,j2))</code>	Take a submatrix
<code>m(roi)</code>	
<code>m.repeat(ny,nx)</code>	Make a bigger matrix from a smaller one
<code>flip(src,dst,dir)</code>	Reverse the order of matrix rows and/or columns
<code>split(...)</code>	Split multi-channel matrix into separate channels
<code>merge(...)</code>	Make a multi-channel matrix out of the separate channels
<code>mixChannels(...)</code>	Generalized form of split() and merge()
<code>randShuffle(...)</code>	Randomly shuffle matrix elements

Example 1. Smooth image ROI in-place

```
Mat imgroi = image(Rect(10, 20, 100, 100));
GaussianBlur(imgroi, imgroi, Size(5, 5), 1.2, 1.2);
```

Example 2. Somewhere in a linear algebra algorithm

```
m.row(i) += m.row(j)*alpha;
```

Example 3. Copy image ROI to another image with conversion

```
Rect r(1, 1, 10, 20);
Mat dstroi = dst(Rect(0,10,r.width,r.height));
src(r).convertTo(dstroi, dstroi.type(), 1, 0);
```

Simple Matrix Operations

OpenCV implements most common arithmetical, logical and other matrix operations, such as

- `add()`, `subtract()`, `multiply()`, `divide()`, `absdiff()`, `bitwise_and()`, `bitwise_or()`, `bitwise_xor()`, `max()`, `min()`, `compare()`

- correspondingly, addition, subtraction, element-wise multiplication ... comparison of two matrices or a matrix and a scalar.

Example. `Alpha compositing` function:

```
void alphaCompose(const Mat& rgba1,
                  const Mat& rgba2, Mat& rgba_dest)
{
    Mat a1(rgba1.size(), rgba1.type()), r1;
    Mat a2(rgba2.size(), rgba2.type());
    int mixch[] = {3, 0, 3, 1, 3, 2, 3, 3};
    mixChannels(&rgba1, 1, &a1, 1, mixch, 4);
    mixChannels(&rgba2, 1, &a2, 1, mixch, 4);
    subtract(Scalar::all(255), a1, r1);
    bitwise_or(a1, Scalar(0, 0, 255), a1);
    bitwise_or(a2, Scalar(0, 0, 255), a2);
    multiply(a2, r1, a2, 1./255);
    multiply(a1, rgba1, a1, 1./255);
    multiply(a2, rgba2, a2, 1./255);
    add(a1, a2, rgba_dest);
}
```

- `sum()`, `mean()`, `meanStdDev()`, `norm()`, `countNonZero()`, `minMaxLoc()`.
 - various statistics of matrix elements.
- `exp()`, `log()`, `pow()`, `sqr()`, `cartToPolar()`, `polarToCart()`
 - the classical math functions.
- `scaleAdd()`, `transpose()`, `gemm()`, `invert()`, `solve()`, `determinant()`, `trace()` `eigen()`, `SVD`,
 - the algebraic functions + SVD class.
- `dft()`, `idft()`, `dct()`, `idct()`,
 - discrete Fourier and cosine transformations

For some operations a more convenient `algebraic notation` can be used, for example:

```
Mat delta = (J.t())*J + lambda*
Mat::eye(J.cols, J.cols, J.type())
.inv(CV_SVD)*(J.t())*err;
```

implements the core of Levenberg-Marquardt optimization
`alg<=1..>`

II

Fi

`fi`

`se`

`bo`

`Gai`

`me`

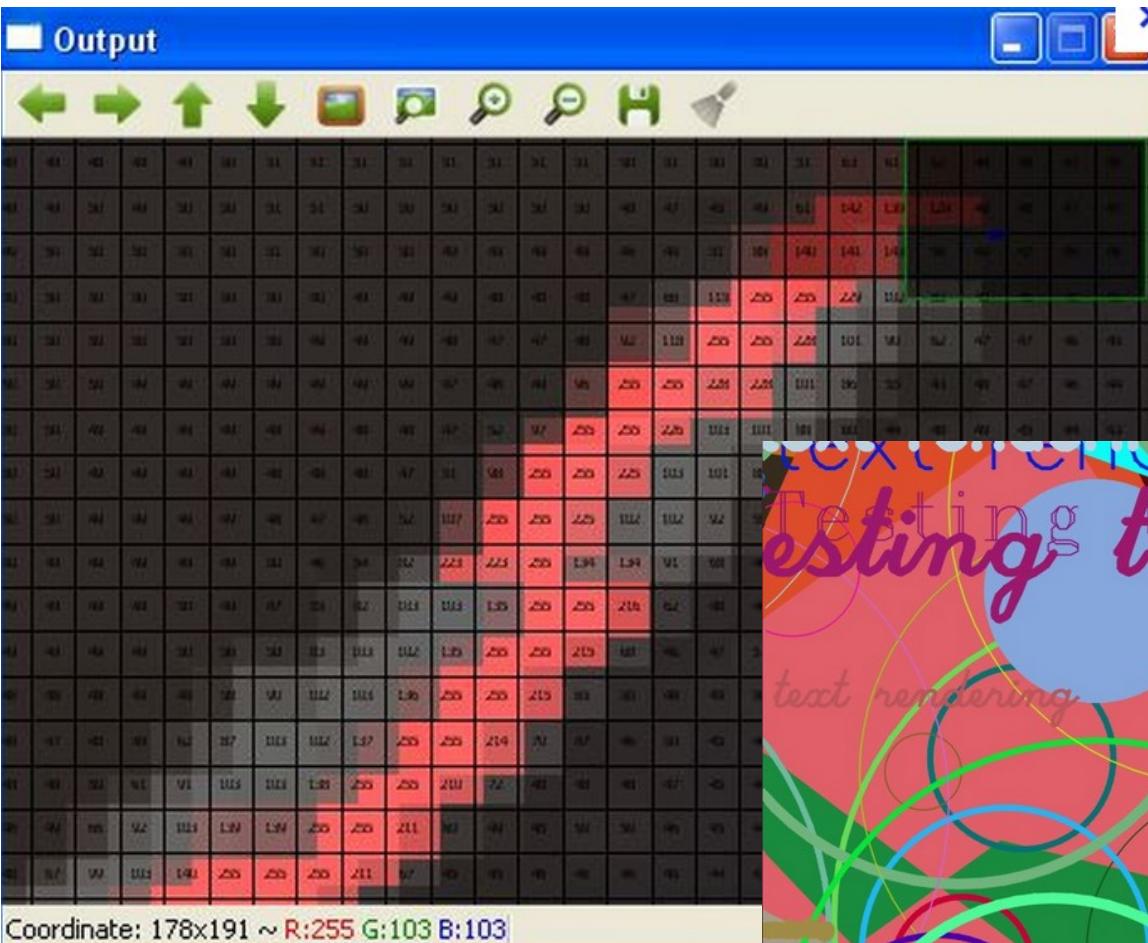
`bi`

`Sol`

`Laj`

`ere`

openCV Modules: HighGUI



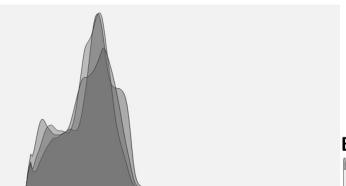
OpenCV Modules: Image Processing



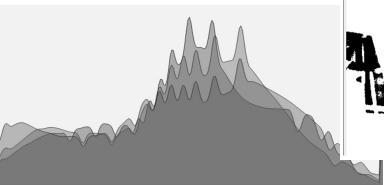
Image



Low Dynamic Range Image
and its Histogram



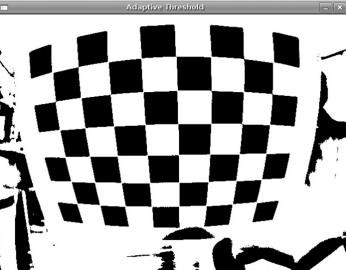
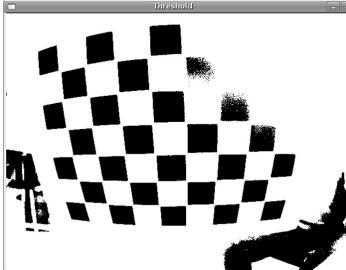
Histogram Equalized Image
and its Histogram



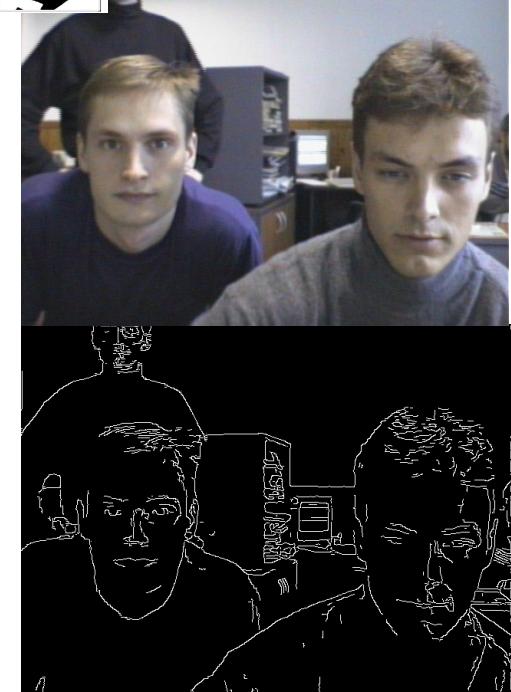
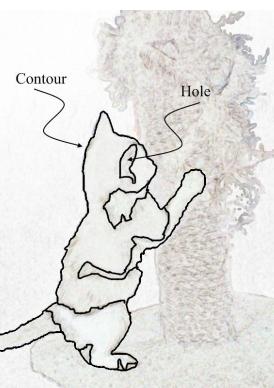
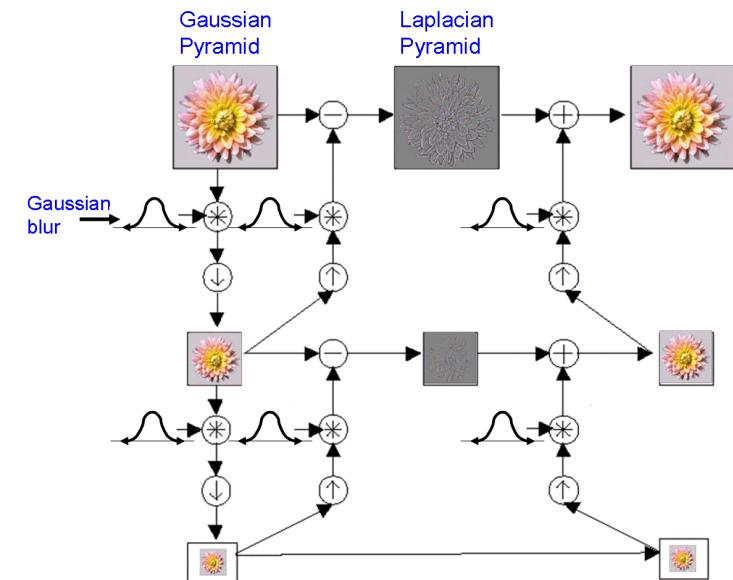
Source Image:



Binary Threshold:



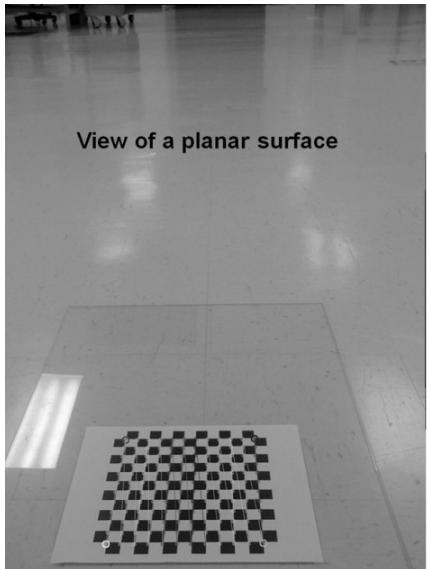
Adaptive Binary
Threshold:



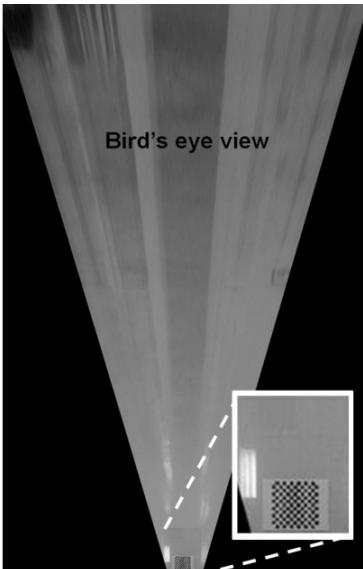


OpenCV Modules: Transforms

Transforms

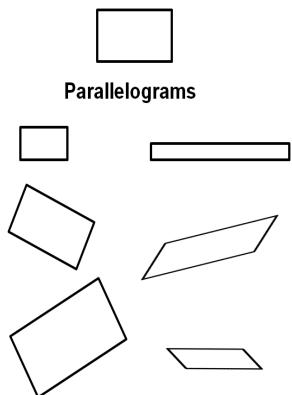


View of a planar surface

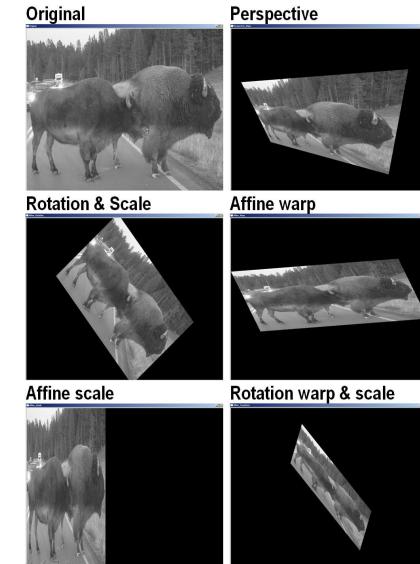
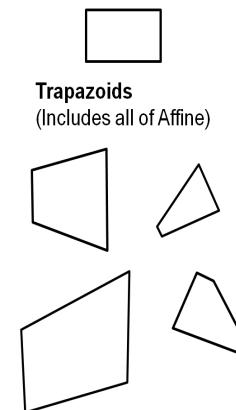


Bird's eye view

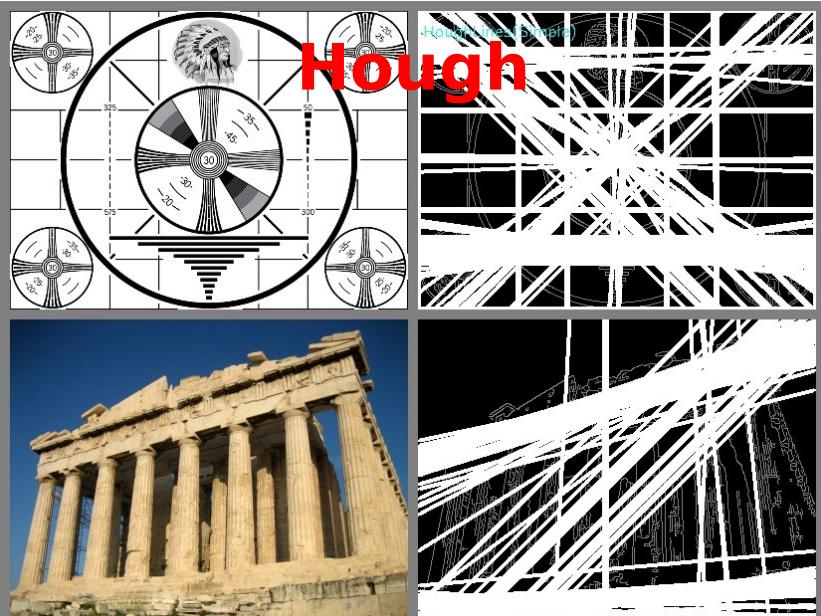
Affine (2x2)



Perspective (3x3)
or "Homography"



Hough



Log-Polar





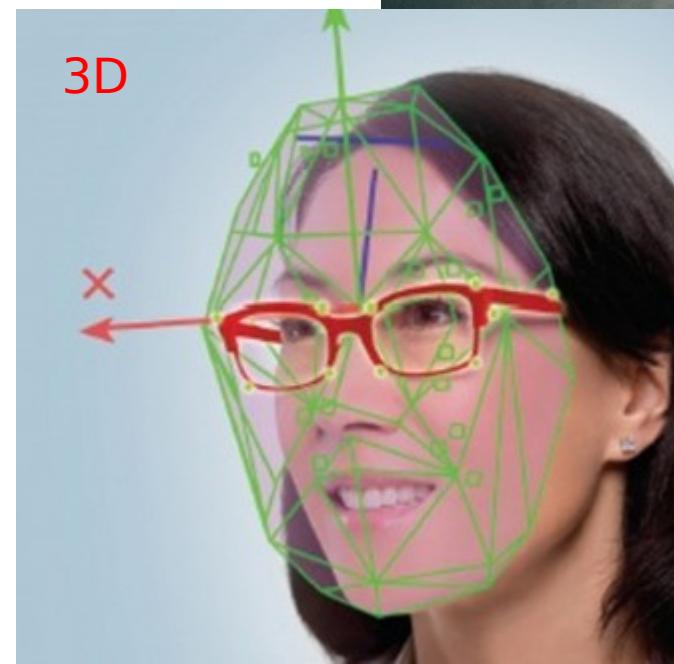
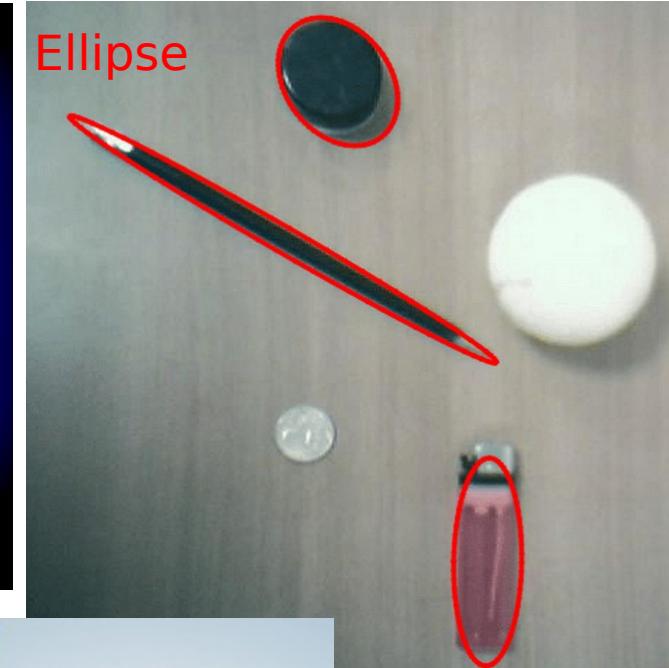
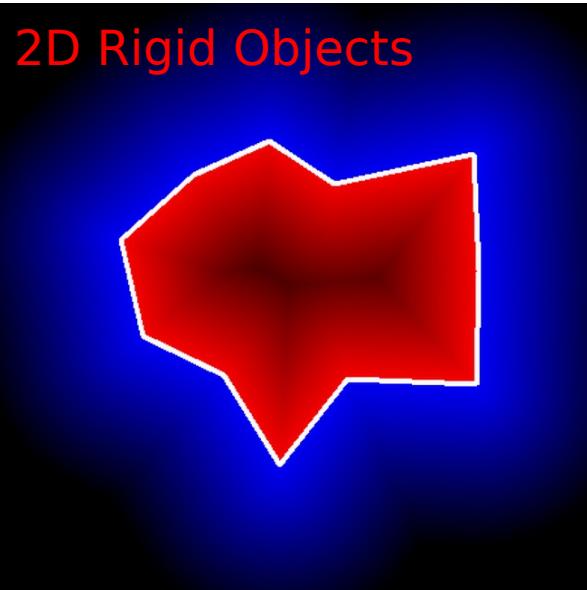
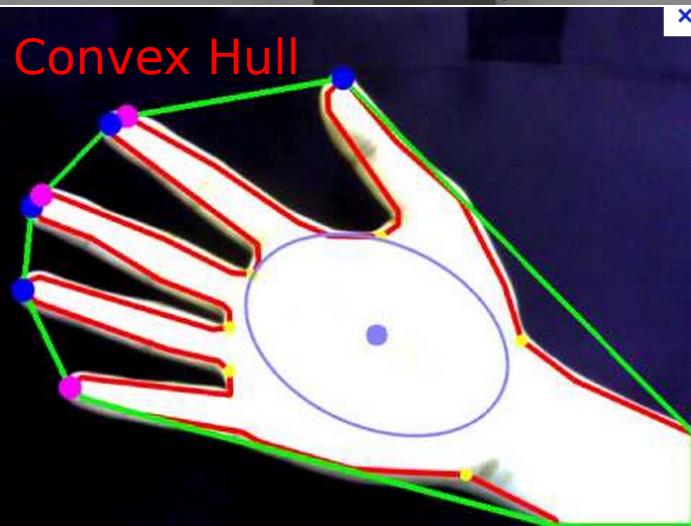
Fitting

OpenCV Modules: Fitting

Delaunay



Convex Hull



OpenCV Modules: Optic Flow, Track

<http://www.youtube.com/watch?v=bWyBGmzfP-g>

Optical Flow Tracking // opencv/samples/c/lkdemo.c

```
int main(...){
```

```
...
```

```
CvCapture* capture = <...> ?  
    cvCaptureFromCAM(camera_id) :  
    cvCaptureFromFile(path);
```

```
if( !capture ) return -1;
```

```
for(;;)
```

```
    IplImage* frame=cvQueryFrame(capture);
```

```
    if(!frame) break;
```

```
    // ... copy and process image
```

```
cvCalcOpticalFlowPyrLK( ...)
```

```
    cvShowImage( "LkDemo", result );
```

```
    c=cvWaitKey(30); // run at ~20-30fps speed
```

```
    if(c >= 0) {
```

```
        // process key
```

```
}
```

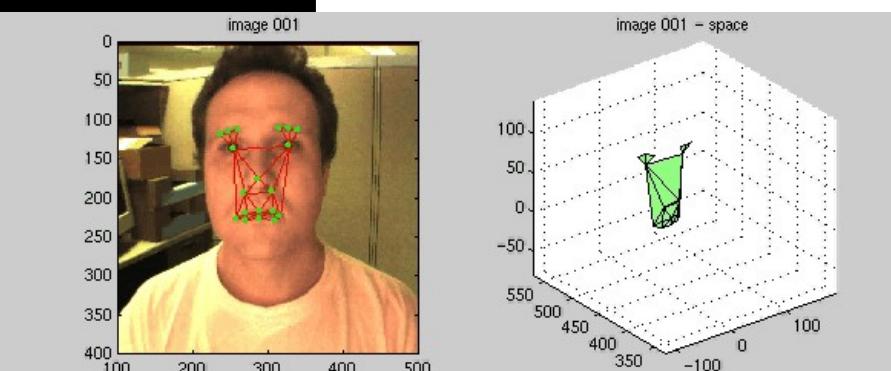
```
cvReleaseCapture(&capture)
```

lkdemo.c, 190 lines
(needs camera to run)

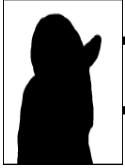
$$\begin{aligned}I(x + dx, y + dy, t + dt) &= I(x, y, t); \\-\partial I / \partial t &= \partial I / \partial x \cdot (dx / dt) + \partial I / \partial y \cdot (dy / dt);\end{aligned}$$

$$G \cdot \partial X = b,$$

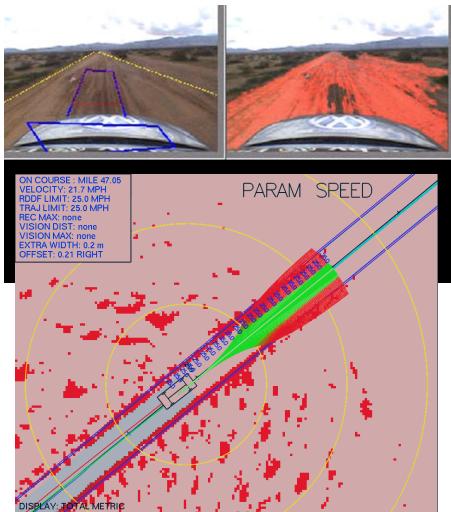
$$\partial X = (\partial x, \partial y), G = \sum \begin{bmatrix} I_x^2, & I_x I_y \\ I_x I_y, & I_y^2 \end{bmatrix}, b = \sum I_t \begin{bmatrix} I_x \\ I_y \end{bmatrix}$$



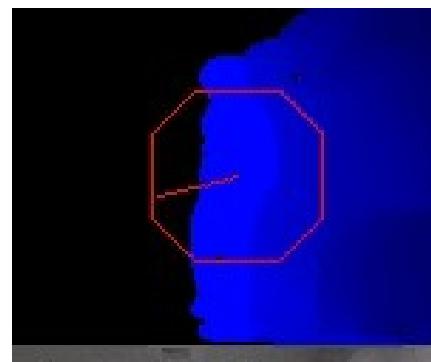
<http://www.youtube.com/watch?v=1osj7kRqsdk>

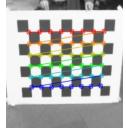


Segmentation



<https://www.youtube.com/watch?v=OxmDonZja>
<http://www.youtube.com/watch?v=Ktrjh5-KLKO>

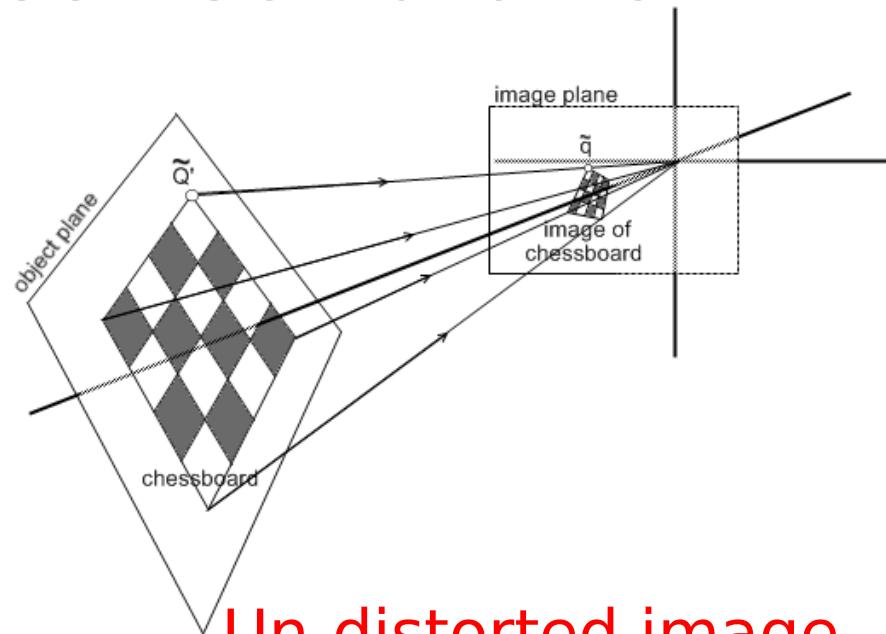
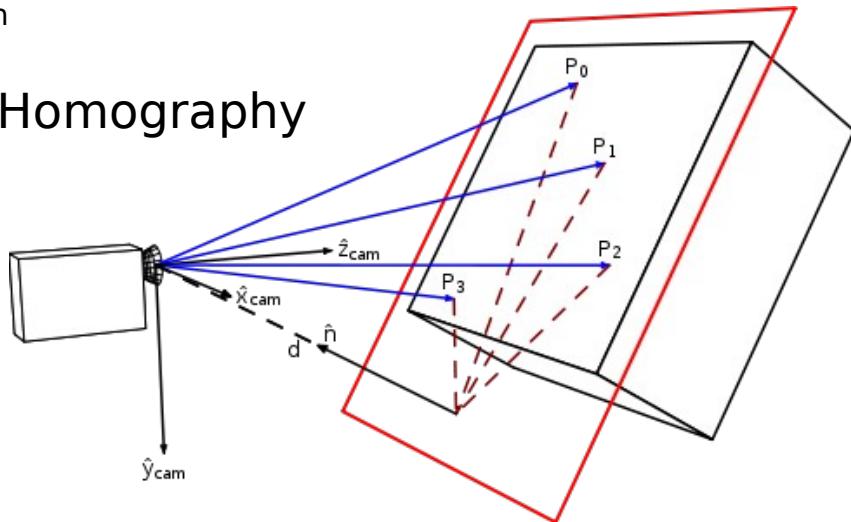




OpenCV Modules: Calibration

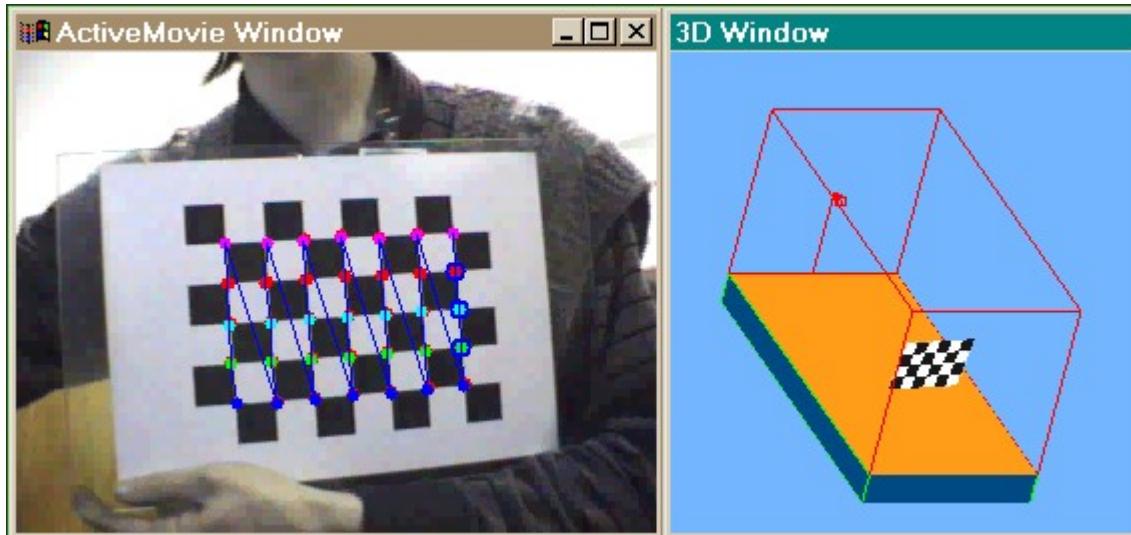
Calibration

Homography

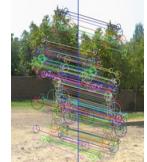


3D view of checkerboard

Un-distorted image



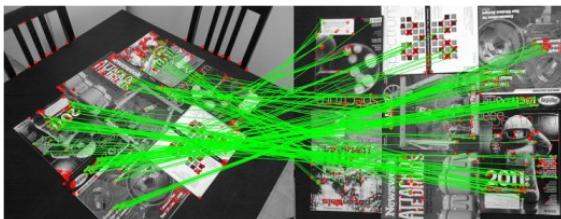
OpenCV Modules: Features, VSLAM



Features
VSLAM

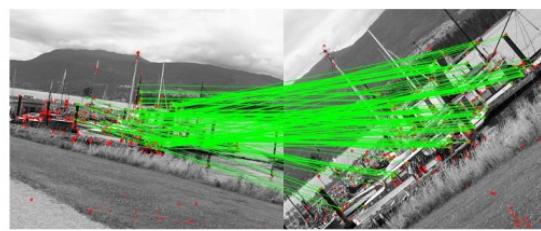
Read two input images:

```
Mat img1 = imread(argv[1], CV_LOAD_IMAGE_GRAYSCALE)
```



Detect keypoints in both images:

```
// detecting keypoints  
FastFeatureDetector detector(15);  
vector<KeyPoint> keypoints1;  
detector.detect(img1, keypoints1);
```



Compute descriptors for each of the keypoints:

```
// computing descriptors  
SurfDescriptorExtractor extractor;  
Mat descriptors1;  
extractor.compute(img1, keypoints1, descriptors1);
```



```
frame          1  
key          0  
keyframes    1  
from start   0.001m  
covered      0.000m  
inliers      319  
outliers     10  
time per frame 34ms
```

FeatureDetectorFast
DescriptorSchemeSAD

Now, find the closest matches between descriptors from the first image

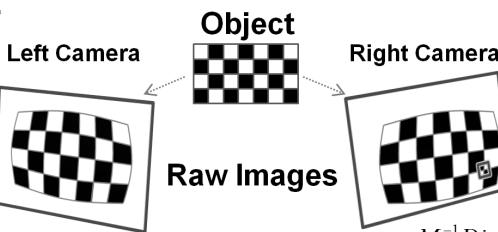
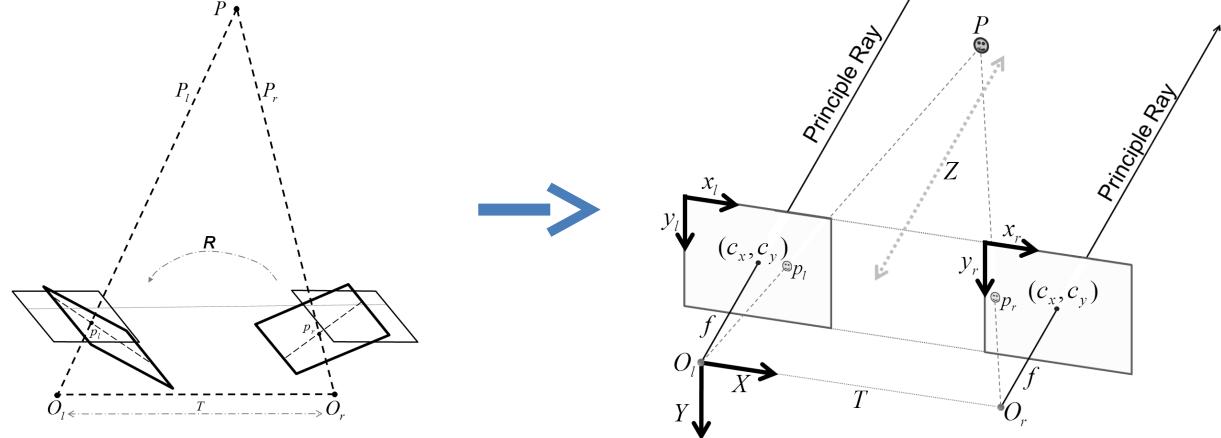
```
// matching descriptors  
BruteForceMatcher<L2<float> > matcher;  
vector<DMatch> matches;  
matcher.match(descriptors1, descriptors2, matches);
```

Change one or both of these lines
to switch detector and/or
descriptor types



Depth, Pose
Normals,
Planes, 3D
Features

OpenCV Modules: Depth. Pose



$$M_r^{-1} \text{Distort}((R_r M_{\text{rect}})^{-1} p')$$

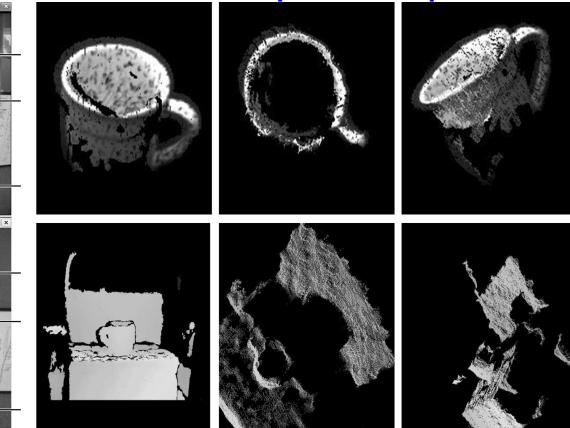
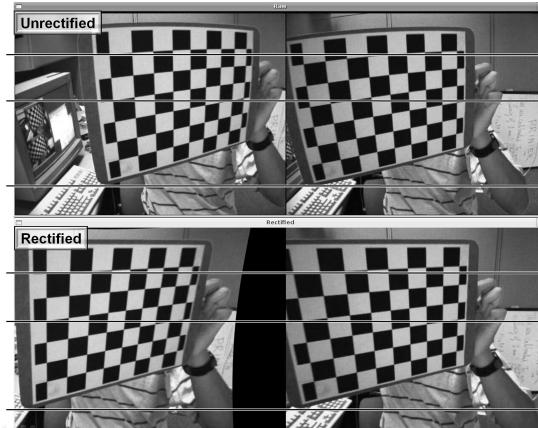
Undistortion

$$(R_r M_{\text{rect}})^{-1} p'$$

Rectify

Left - right feature alignment

Some examples of 3D stereo depth maps:





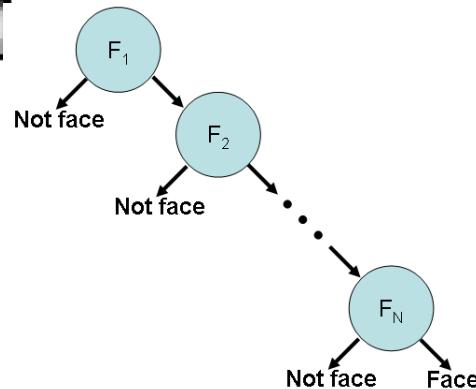
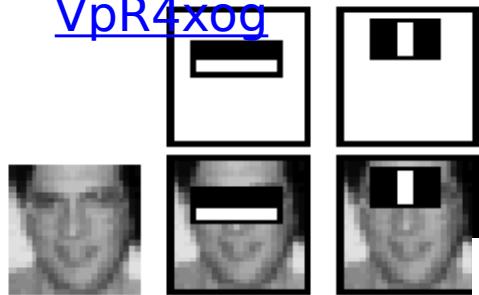
OpenCV Modules: Obj Rec/ML

Object
recognition
Machine learning



<http://youtu.be/i1uUuWwbIcc>

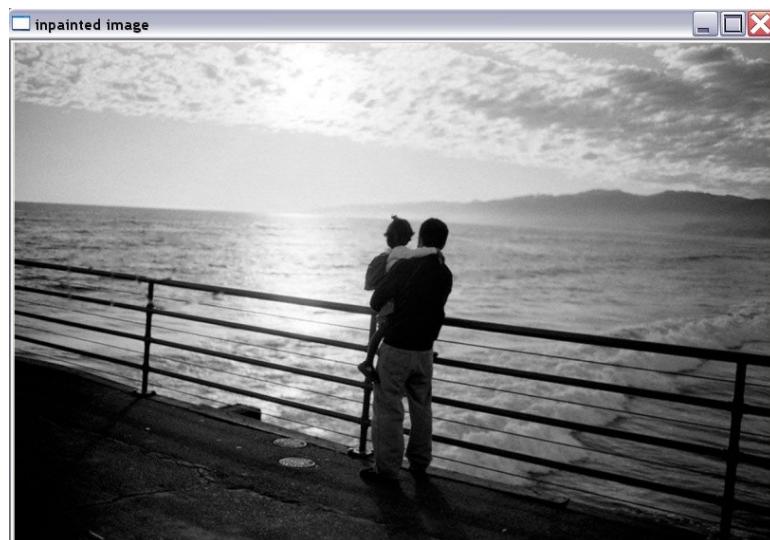
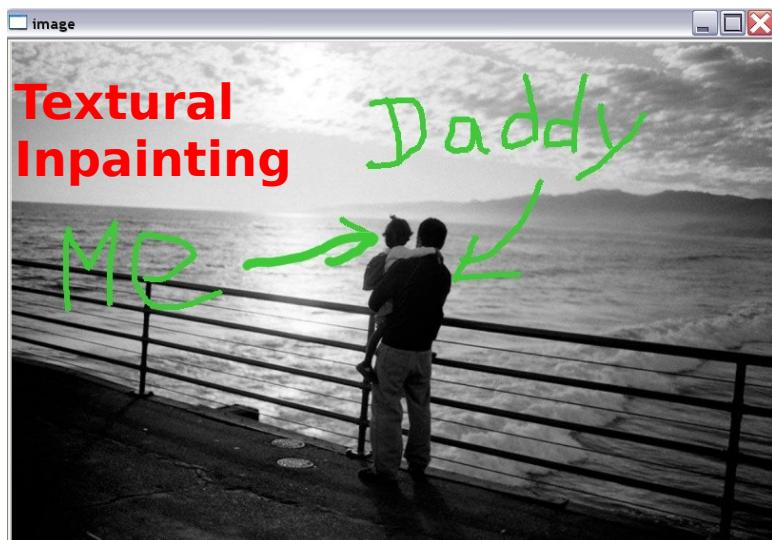
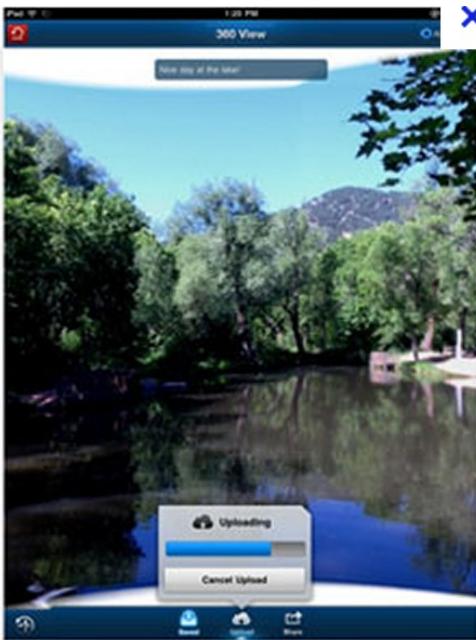
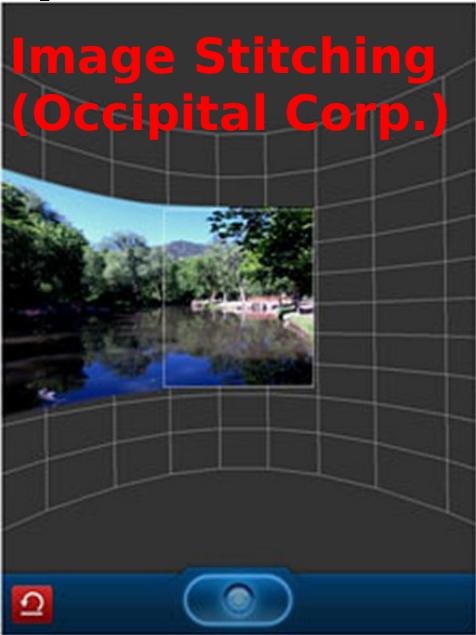
https://www.youtube.com/watch?v=_RF0VpR4xog





OpenCV Modules: Comp Photog

Computational
Photography



Brand New in OpenCV 3.0

User Contrib Module

- Thanks to Google Summer of Code!!
 - Supporting 15 interns!

Accepted pull requests:

- | | |
|--------------------------------|--|
| Extended Python interface | 8. New line segment detector |
| 3D object recognition and pose | Haze removal, depth estimation |
| KAZE features | 10. GPU accelerated dense optical flow |
| bar detection | 11. DTAM & pose estimation |
| computational photography | 12. PNP pose detection |
| custom calibration and planar | 3D visual saliency filters |
| dense optical flow | 14. Text detection and reading in wild |
| | 15. TLD tracker |

OpenCV Examples

- Industrial Perception
- Magic Leap

Industrial Perception



- **Sensor driven,**
- **Real time planning**
- **Applied to distribution**



Magic Leap

- Augmented Reality done right
- Lots of computer vision (**We're hiring**)



- Gesture recognition demo

Gesture ... was going to be live
demo



FINISH

ipi

Questions?



Photo: ⁴⁴ Gary Bradski

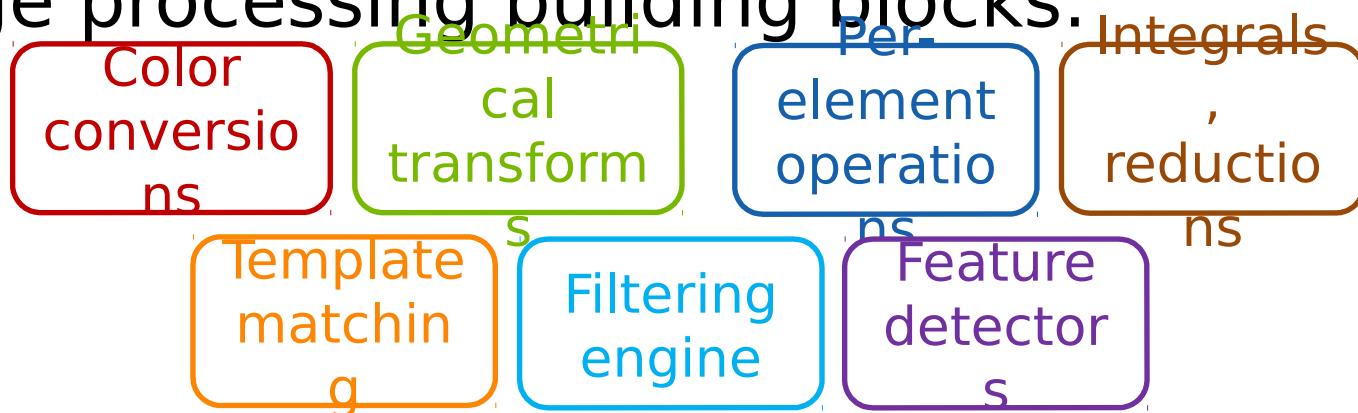
Language Modules

- GPU/Cuda
- Android
- iOS
- Python
- Java



OpenCV GPU Module:

- Image processing building blocks:



- High-level algorithms:



OpenCV GPU Module Example

```
Mat frame;
VideoCapture capture(camera);
cv::HOGDescriptor hog;

hog.setSVMClassifier(cv::HOGDescriptor
    ::getgetDefaultPeopleDetector());

capture >> frame;

vector<Rect> found;
hog.detectMultiScale(frame, found,
    1.4, Size(8, 8), Size(0, 0),
    1.05, 8);
```

```
Mat frame;
VideoCapture capture(camera);
cv::gpu::HOGDescriptor hog;

hog.setSVMClassifier(cv::HOGDescriptor
    ::getgetDefaultPeopleDetector());

capture >> frame;

GpuMat gpu_frame;
gpu_frame.upload(frame);

vector<Rect> found;
hog.detectMultiScale(gpu_frame,
    found,
    1.4, Size(8, 8), Size(0, 0),
    1.05, 8);
```

- Designed very similar!



OpenCV GPU Module

Performance

Tesla C2050 (Fermi) vs. Core i5-760 2.8GHz (4 cores, TBB, SSE)

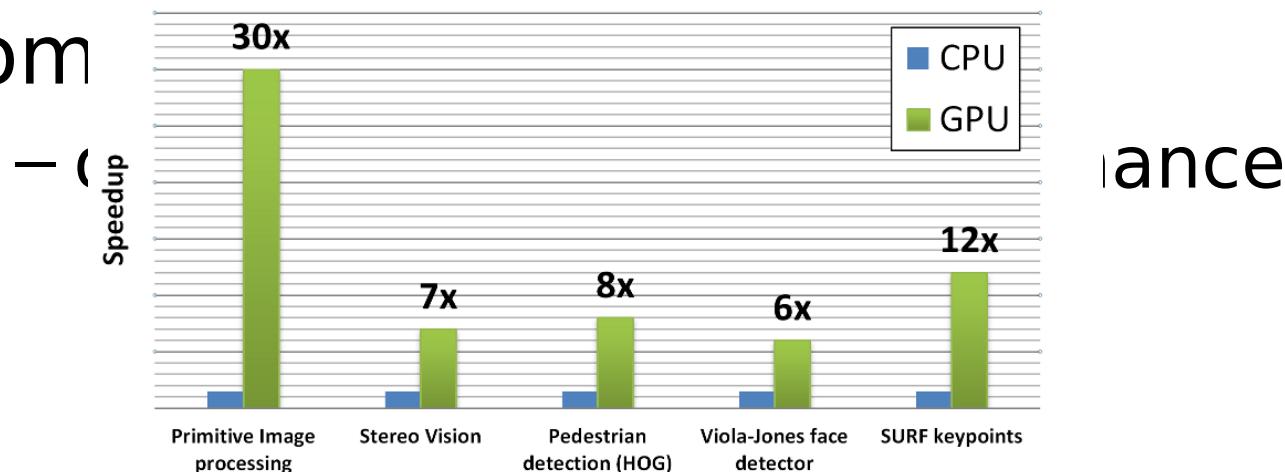
– Average speedup for primitives:

33x

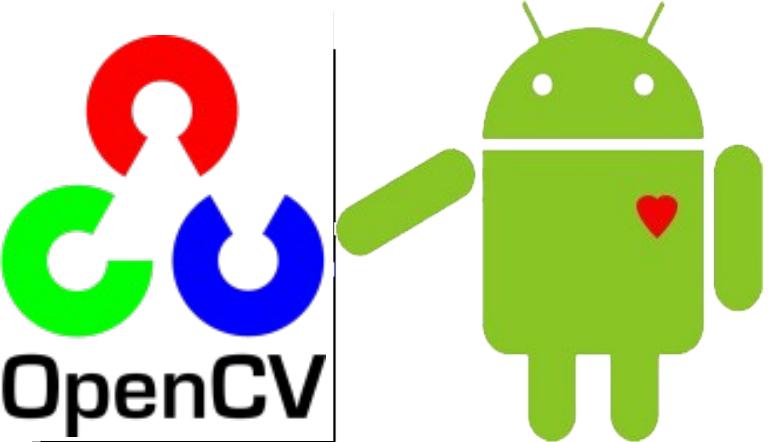
- For “good” data (large images are better)
- Without copying to GPU



What can you get from your
com



OpenCV Android Module



- **OpenCV 2.4 for Android:**
 - Native Android Camera Support
 - Multithreading
 - Java API (soon)
 - Tegra HW Optimizations (soon)



Wiki with the latest information:

<http://opencv.org/platforms/android.html>

Support/discussion group:::<https://groups.google.com/group/android-opencv>

OpenCV iOS Module

- Full support

ios



OpenCV Python Module

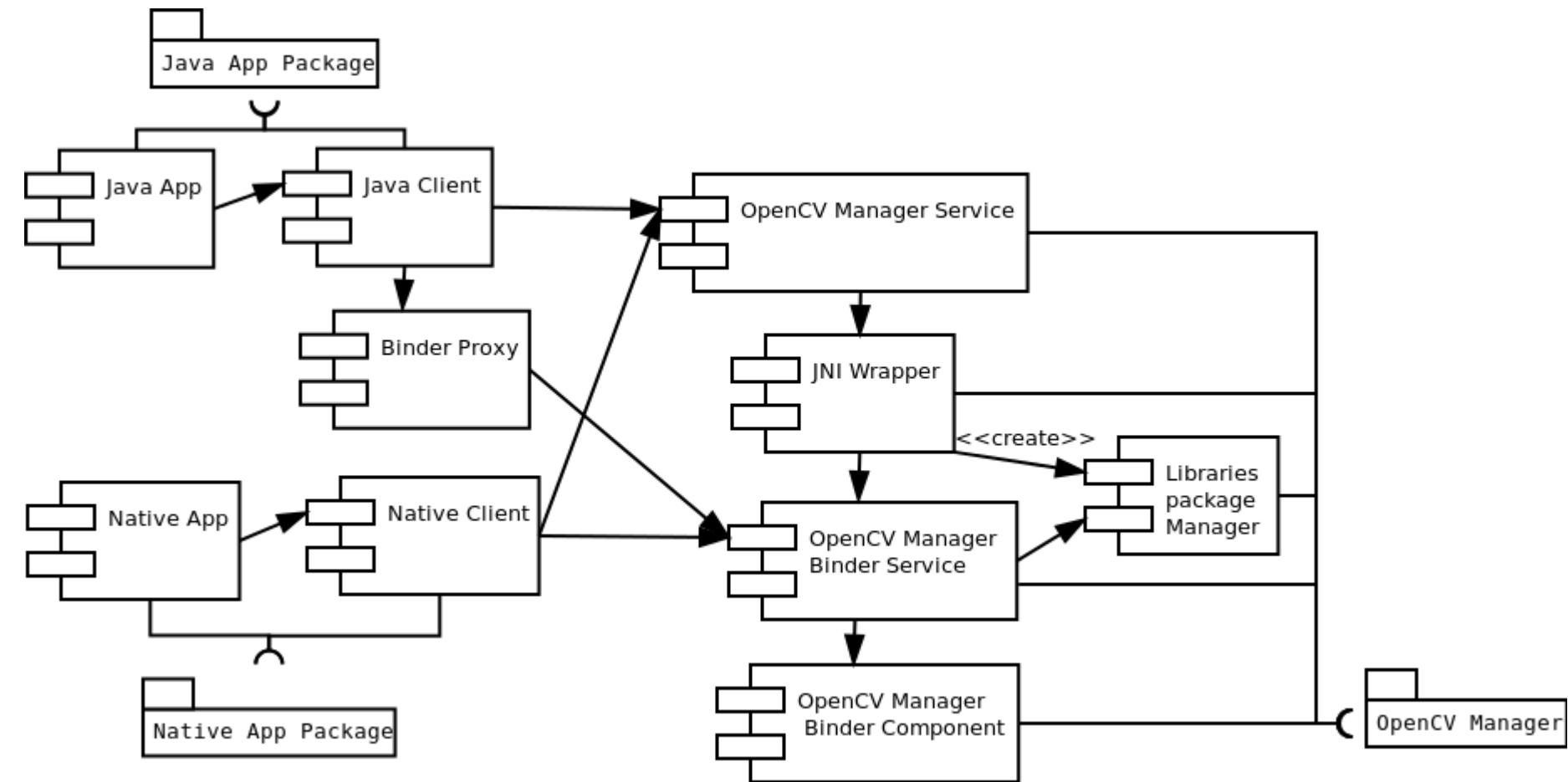
- Full Python interface
- Example: Depth image from Kinect:

```
import numpy
import cv
from freenect import sync_get_depth as get_depth, sync_get_rgb as
get_video
while True:
    (depth,_) ,(rgb,_) =get_depth(),get_video()
    depth=depth.astype(numpy.uint8)
    cv.ShowImage ("depth",depth)
    cv.ShowImage ("depth",rgb)
```



Depth image

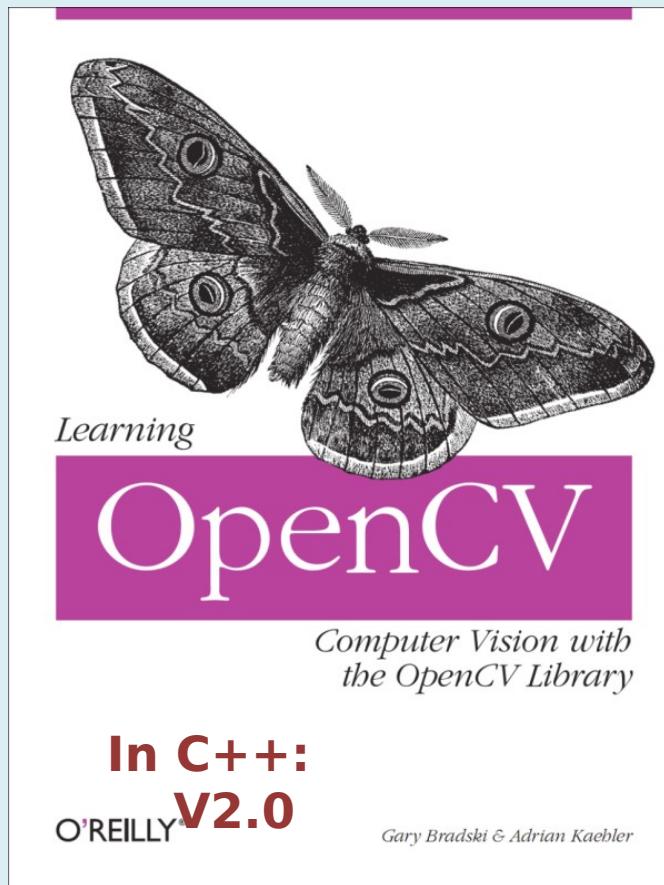
OpenCV Java Module



Book and Foundation

Learning OpenCV V2.0

- Out in Summer 2014!



OpenCV Foundation Support

SUPPORT (an answer within the amount of opening days):

level 0: 1K support within 1 week

level 1: 5K support within 1 week and dedicated machine on build farm

level 2: 10K support within 3 days and dedicated machine on build farm

level 3: 20K support within 24h and dedicated machine on build farm

level 4: 30K support within 24h, dedicated machine on build farm and fixes when errors happen on the machine

SPONSORSHIP:

Diamond	\$250K	Level 4 support. Can direct OpenCV development/Strategy/priorities. Board position. Able to brainstorm solutions to proprietary problems with the team. Front page logos
Platinum	\$100K	Level 3. Board position, strong influence on priorities real time support as above. Front page logos
Gold	\$50K	Level 2. Advisory board (suggest priorities). Quarterly brainstorm
Silver	\$25K	Level 1. Advisory board. bi-yearly brainstorm logo on workshops
Titanium	\$10K	Level 0. Logo on prize sponsorship
Bronze	\$5K	Logo on bounties
Contributor	<\$1K	Contributor page